



University of  
Pittsburgh

# Algorithms and Data Structures 2

## CS 1501



Spring 2023

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(Slides are adapted from Dr. Ramirez's and Dr. Farnan's CS1501 slides.)

# Announcements

- Upcoming Deadlines
  - Homework 6: this Friday @ 11:59 pm
  - Lab 5: Tuesday 2/28 @ 11:59 pm
  - Assignment 2: Friday 3/17 @ 11:59 pm
    - Support video and slides on Canvas
- Midterm Exam on Wednesday 3/1
  - in-person, closed-book
  - Study guide and old exams on Canvas
  - Practice questions on GradeScope (with answers)
- Lost points because autograder or simple mistake?
  - please reach out to Grader TA over Piazza
- Navigating the Panopto Videos
  - Video contents
  - Search in captions

# Previous lecture

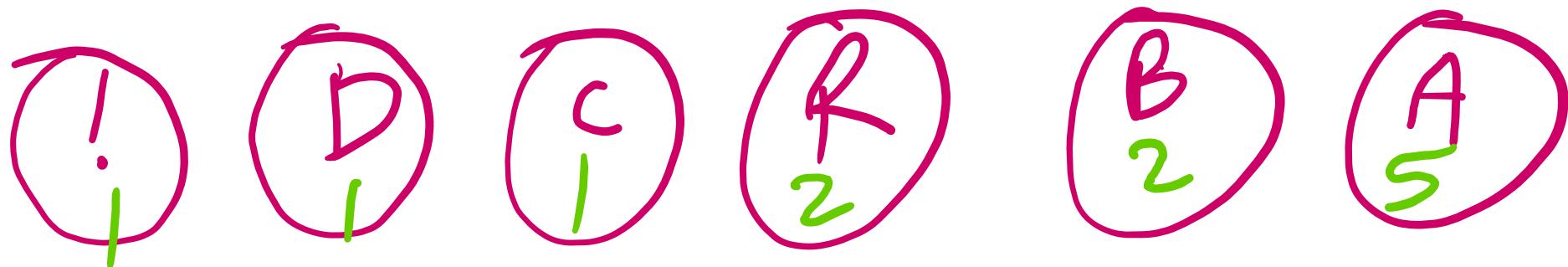
- Huffman Compression

# This Lecture

- Huffman Compression
- Run-length Encoding
- LZW

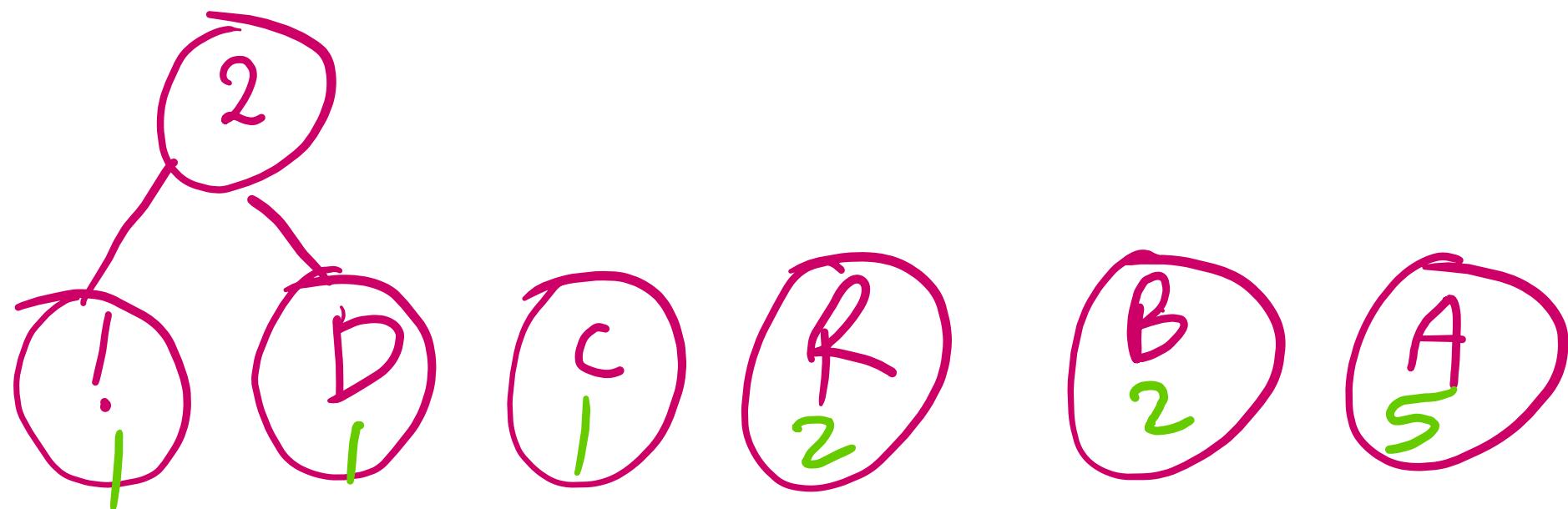
# Huffman Compression Example

- Build a tree for “ABRACADABRA!”
- file size:  $n = 12$
- no. of unique characters:  $K = 6$



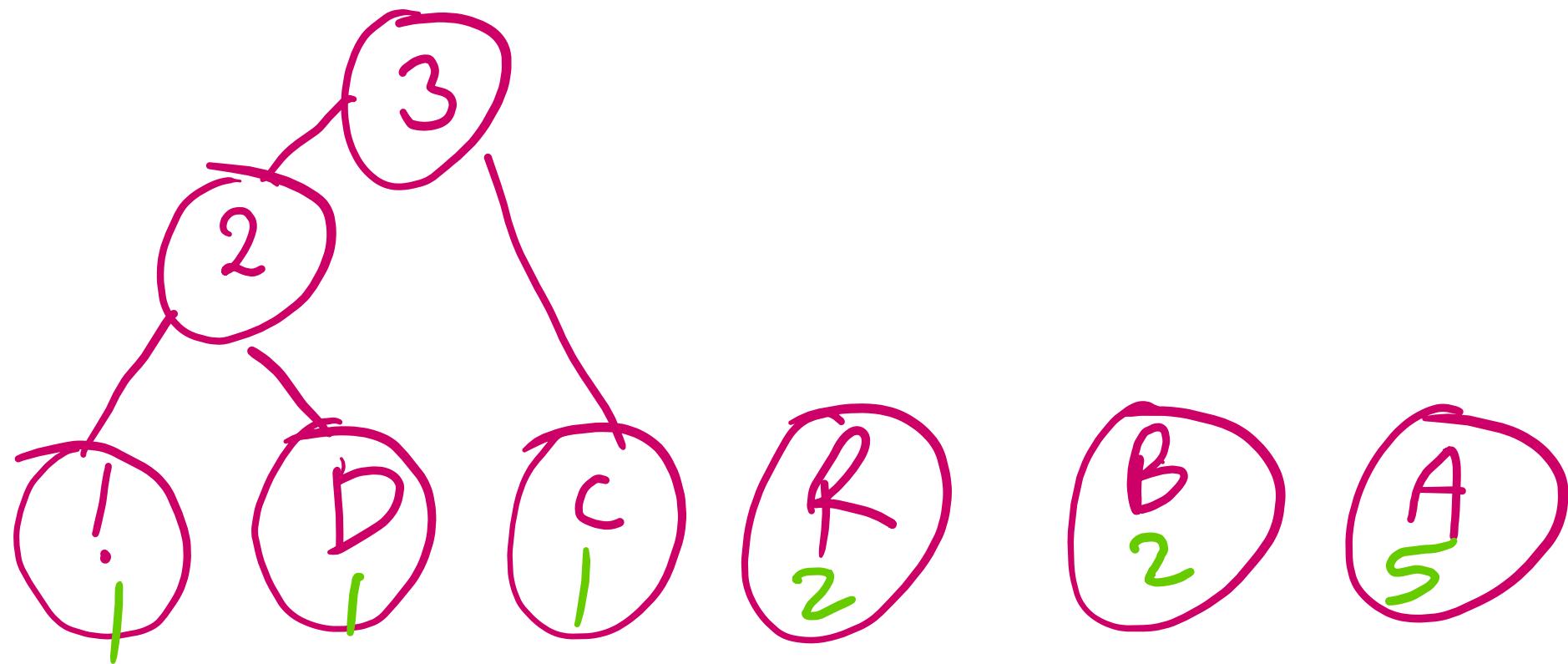
# Example

- Build a tree for “ABRACADABRA!”



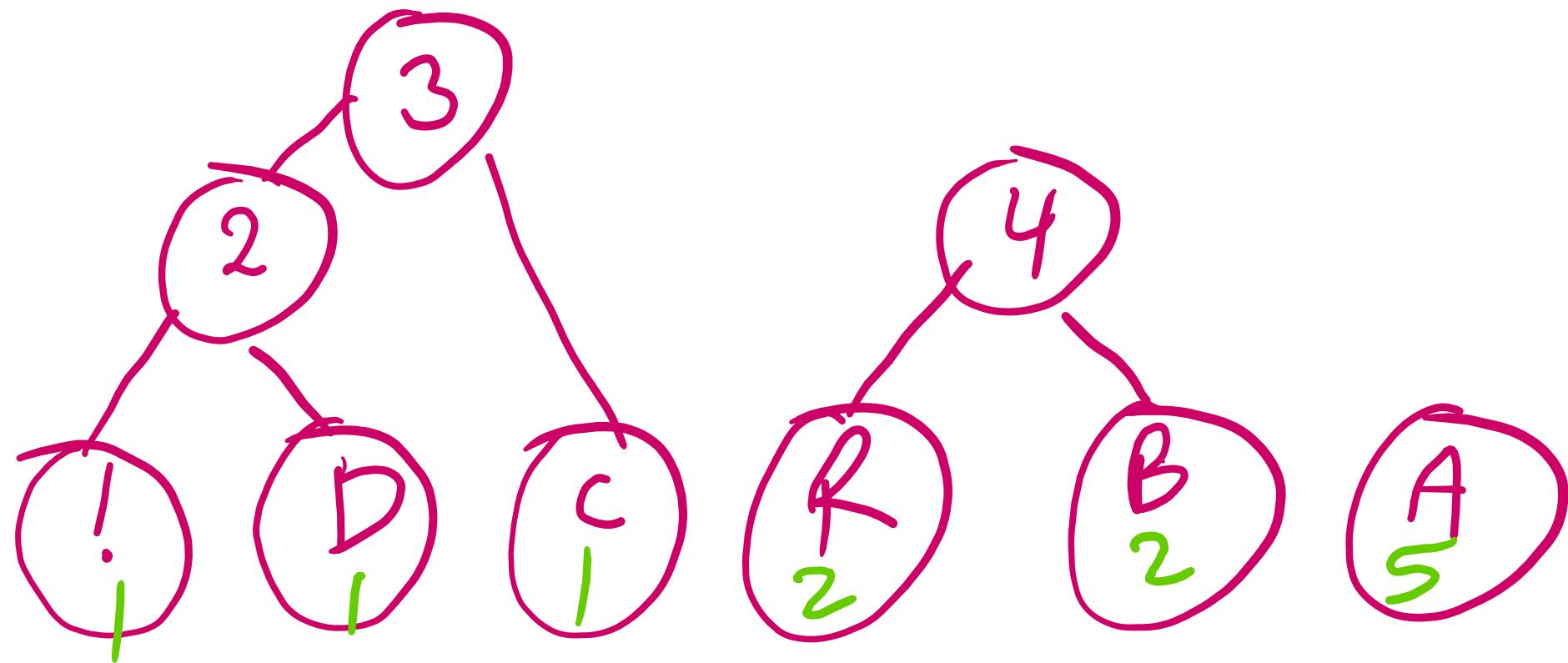
# Example

- Build a tree for “ABRACADABRA!”



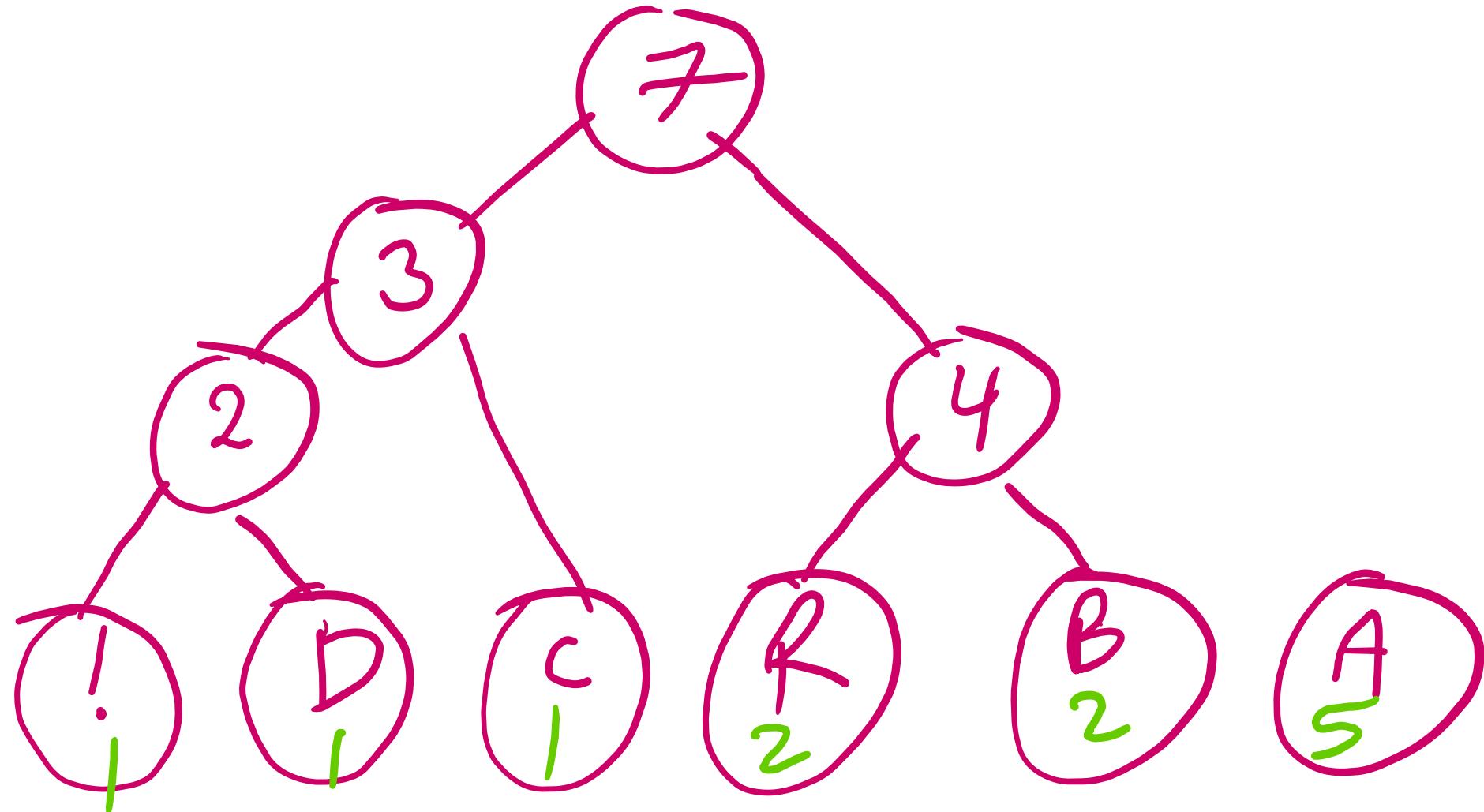
# Example

- Build a tree for “ABRACADABRA!”



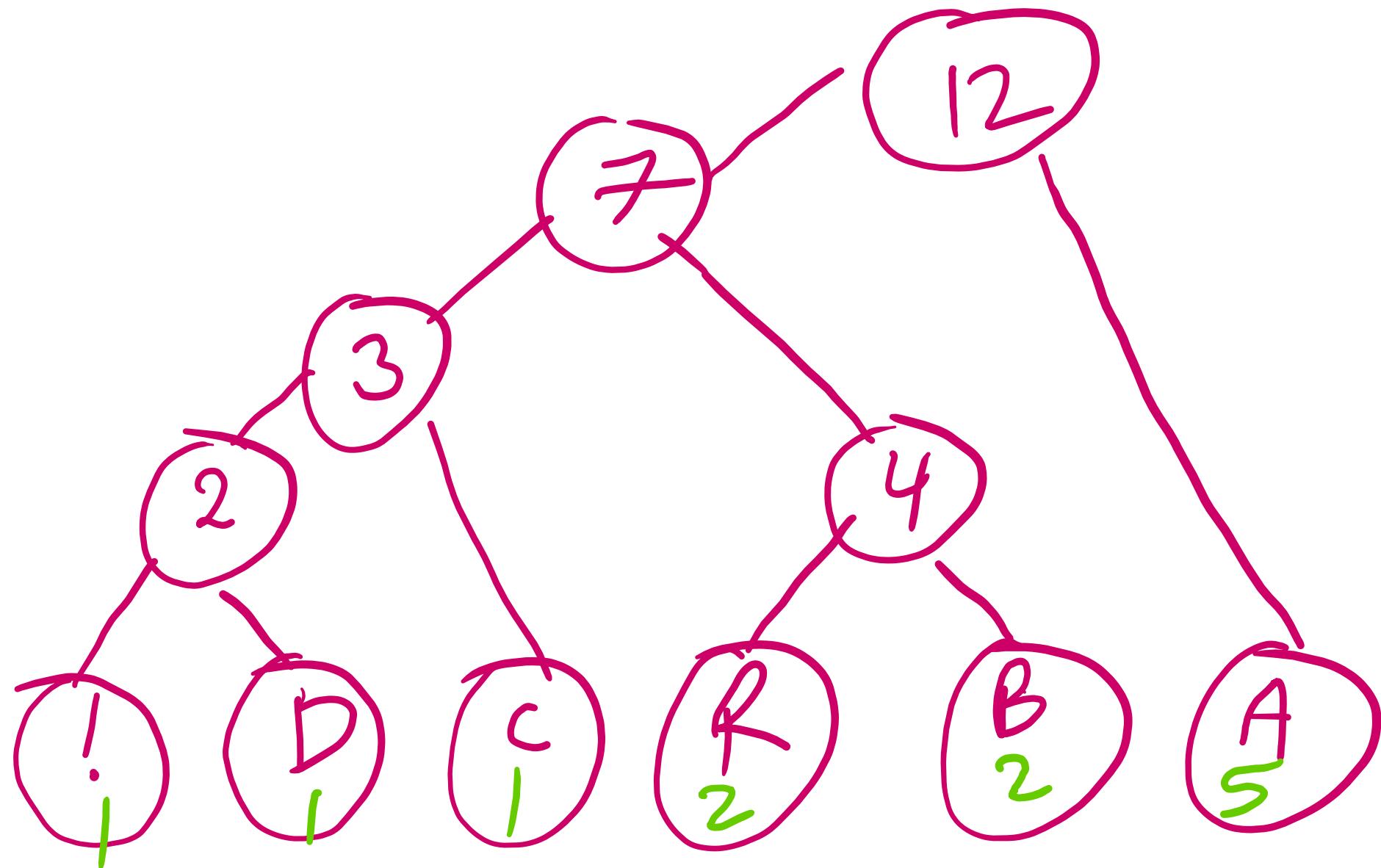
# Example

- Build a tree for “ABRACADABRA!”



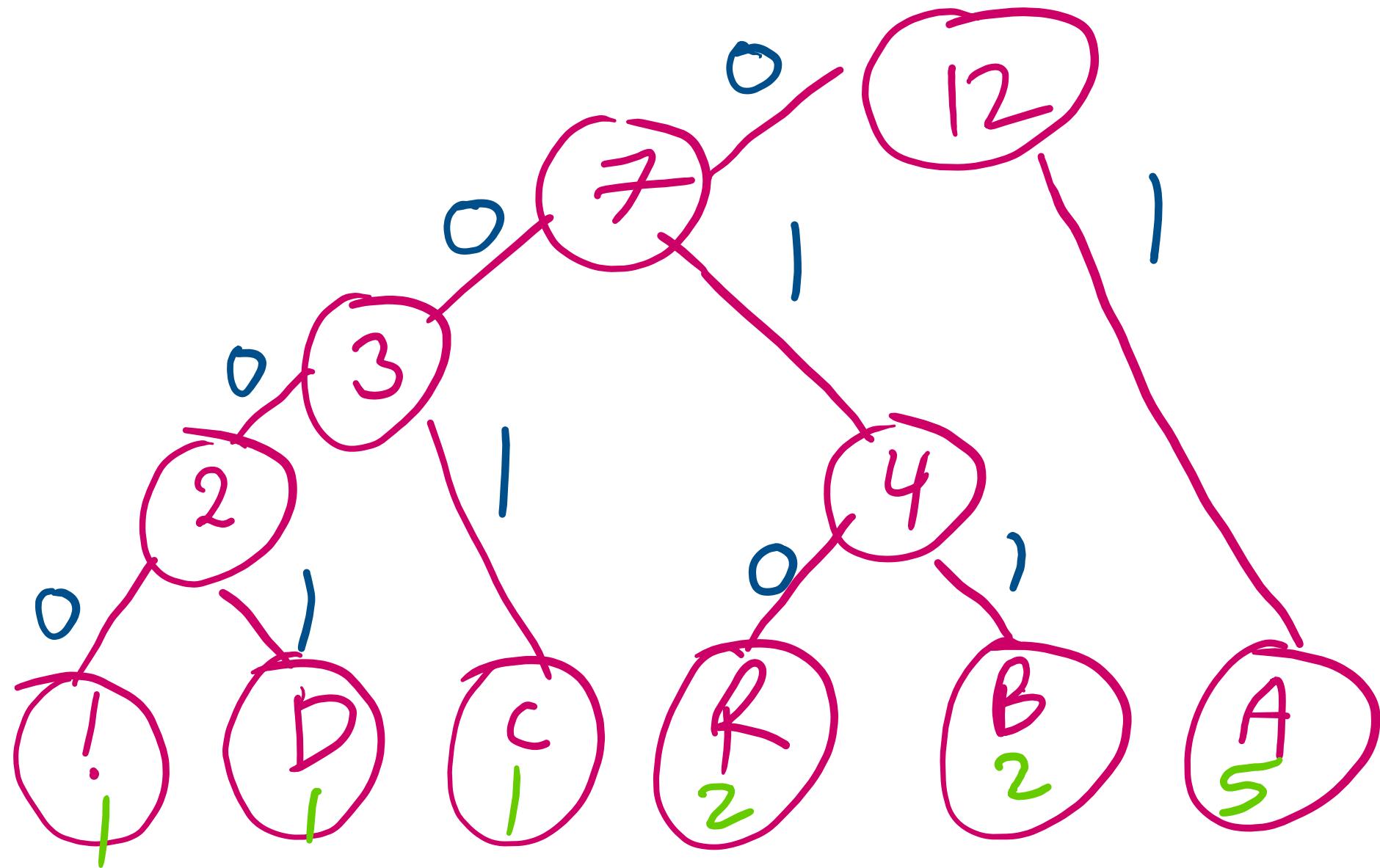
# Example

- Build a tree for “ABRACADABRA!”



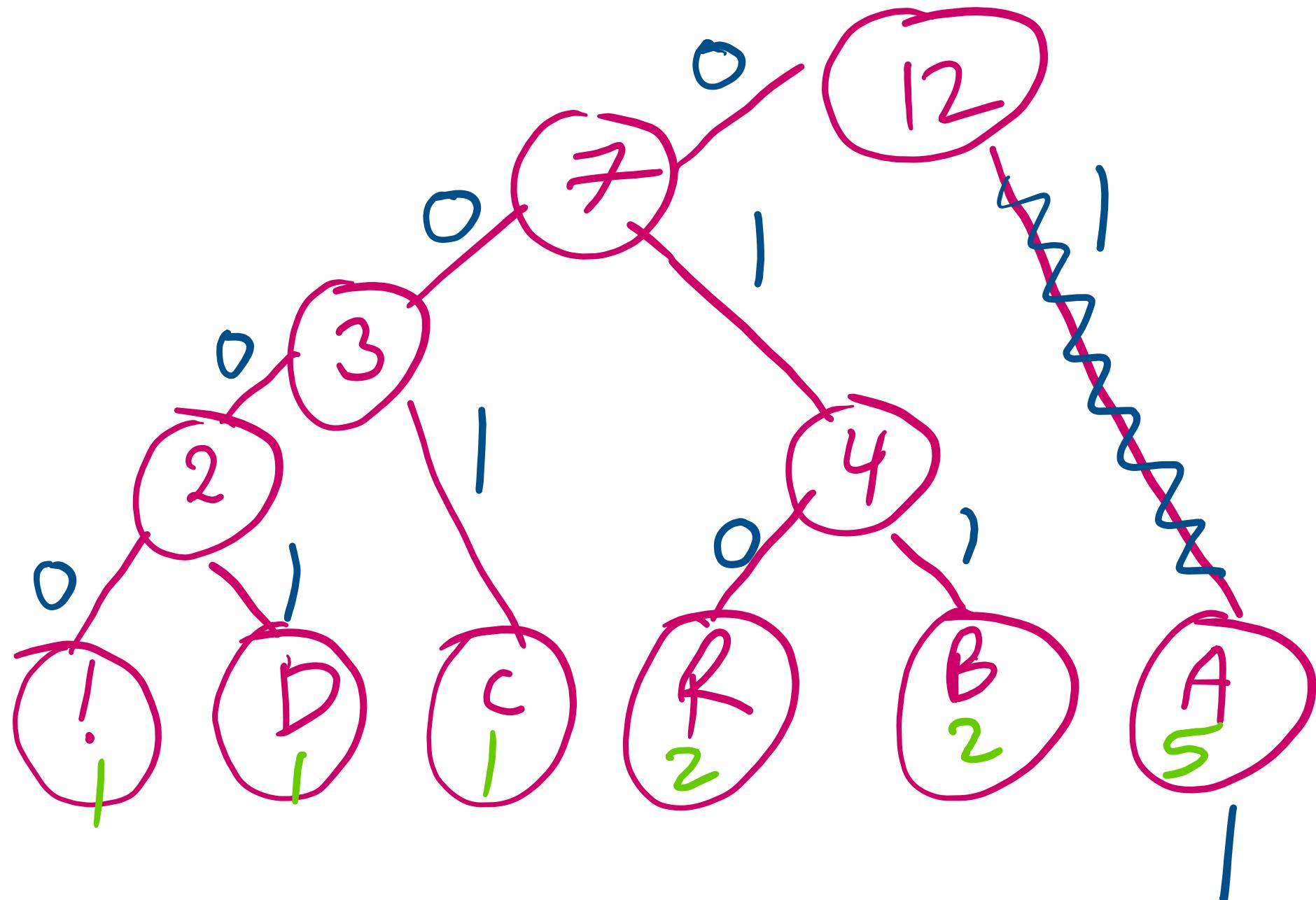
# Example

- Build a tree for “ABRACADABRA!”



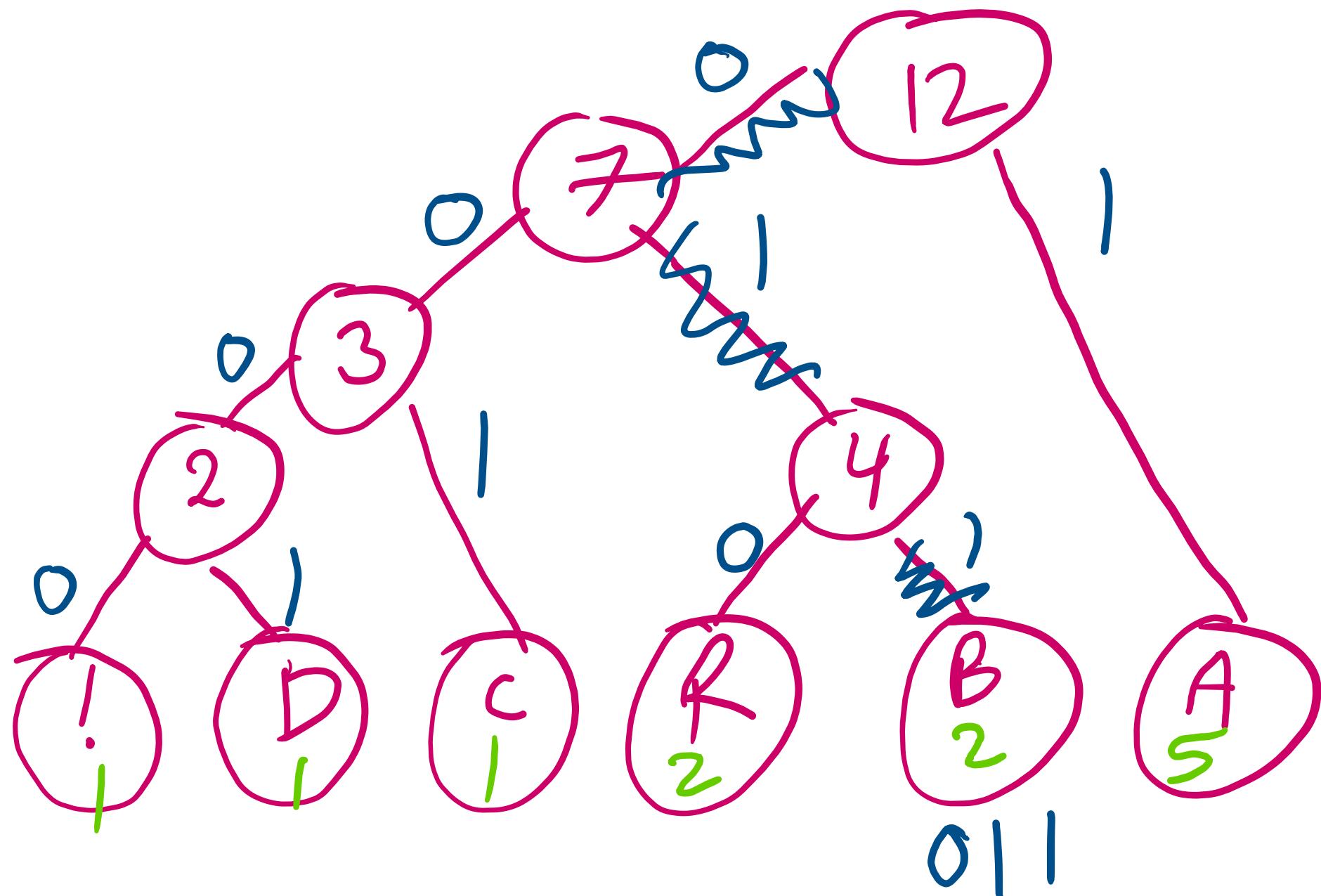
# Example

- Build a tree for “ABRACADABRA!”



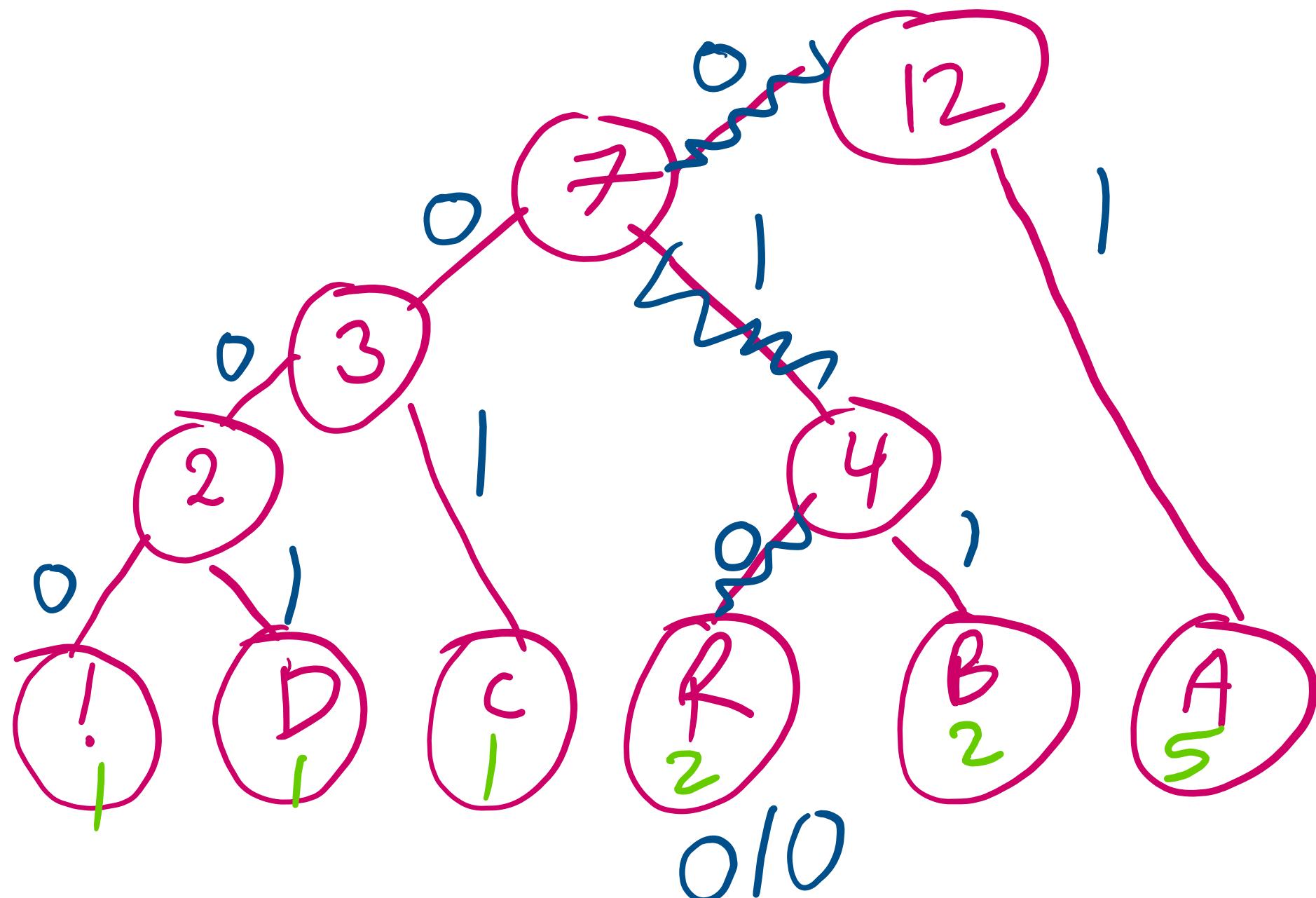
# Example

- Build a tree for “ABRACADABRA!”



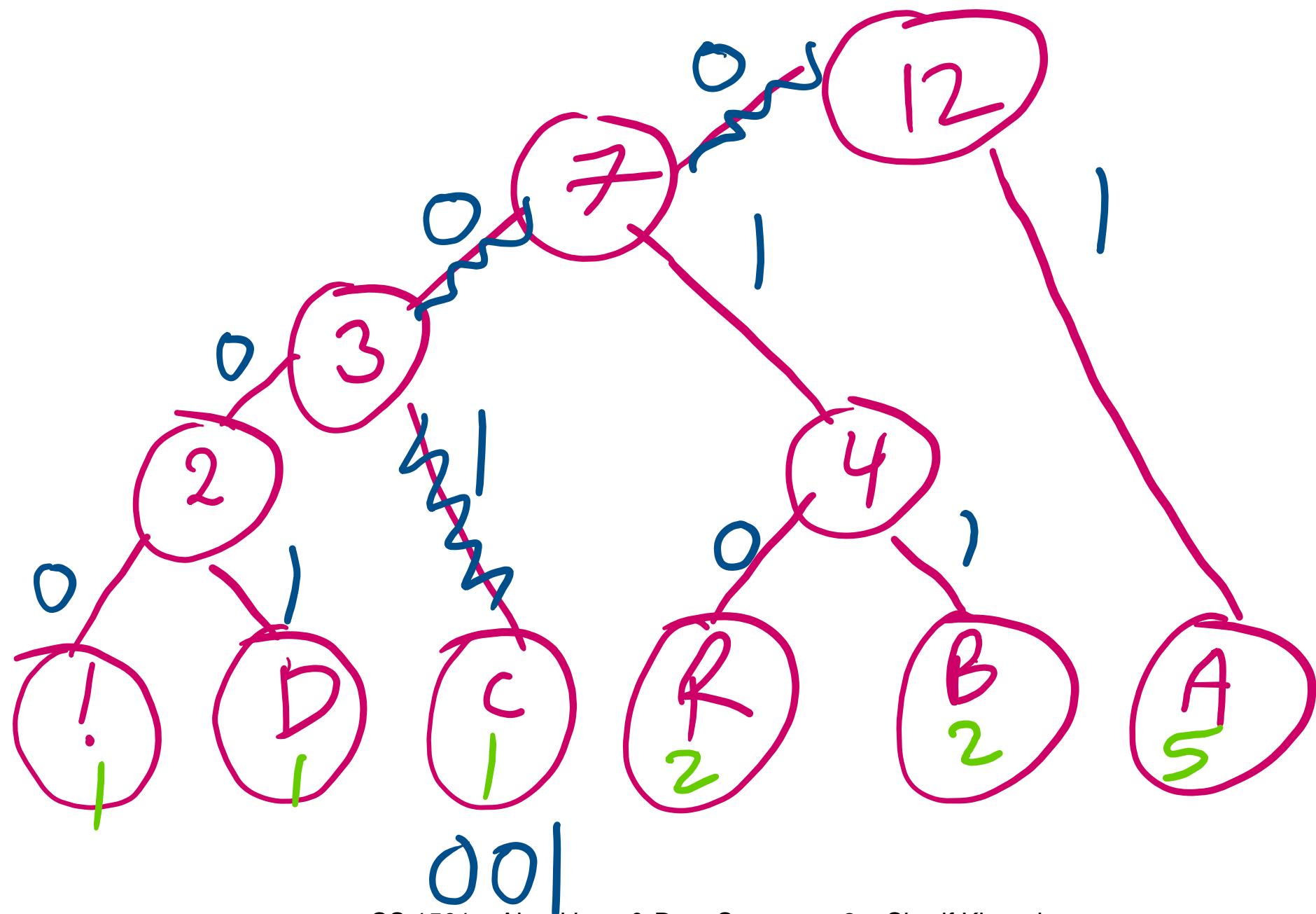
# Example

- Build a tree for “ABRACADABRA!”



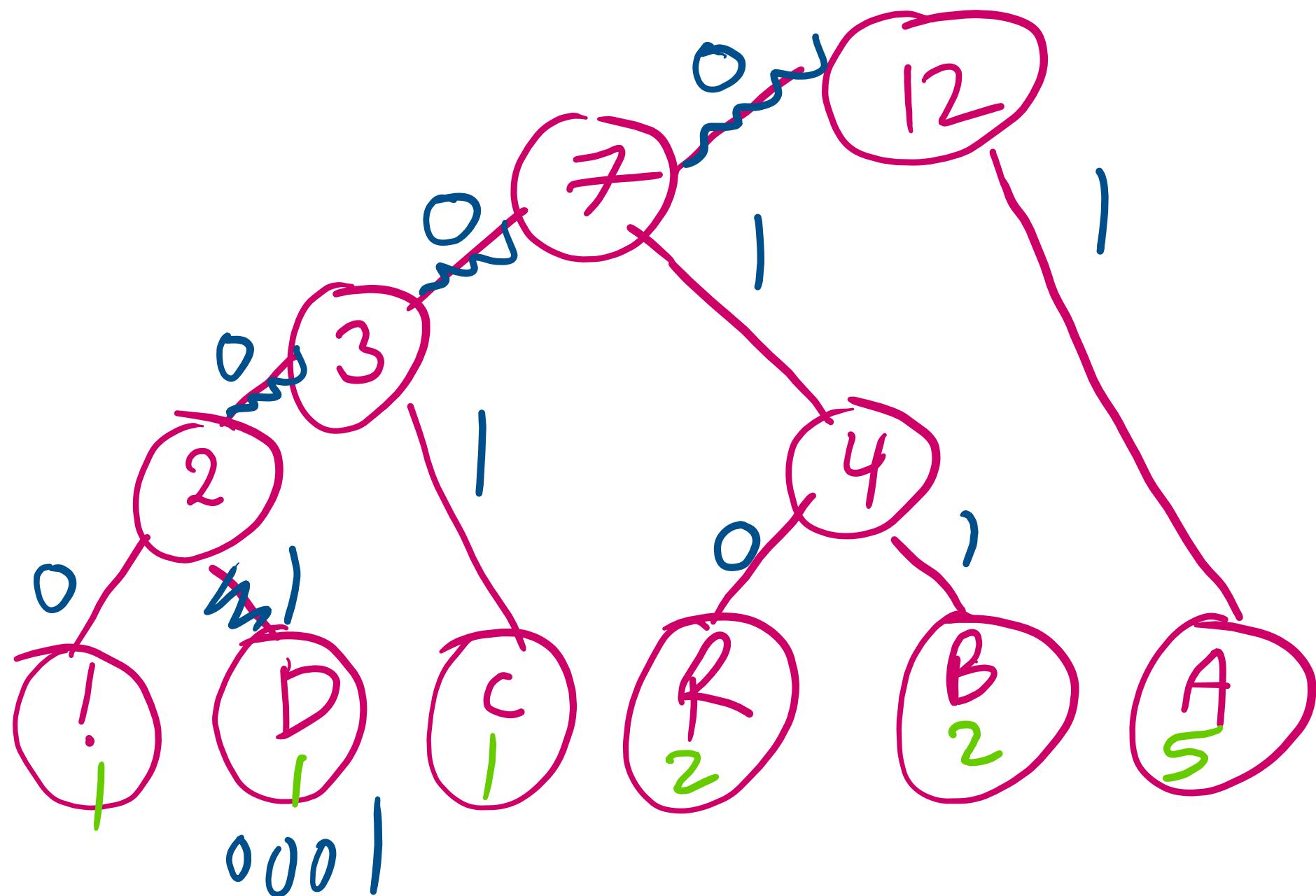
# Example

- Build a tree for “ABRACADABRA!”



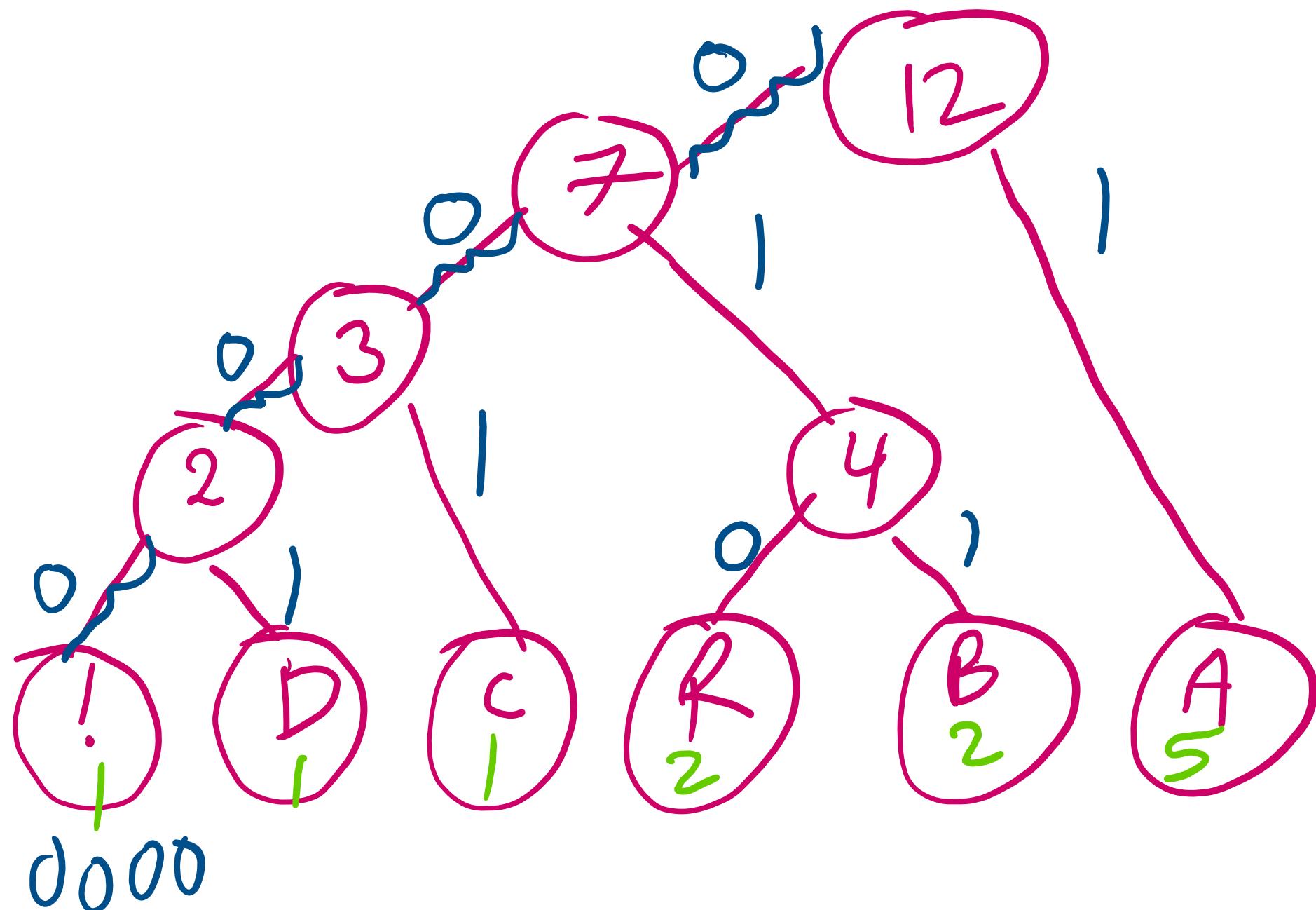
# Example

- Build a tree for “ABRACADABRA!”



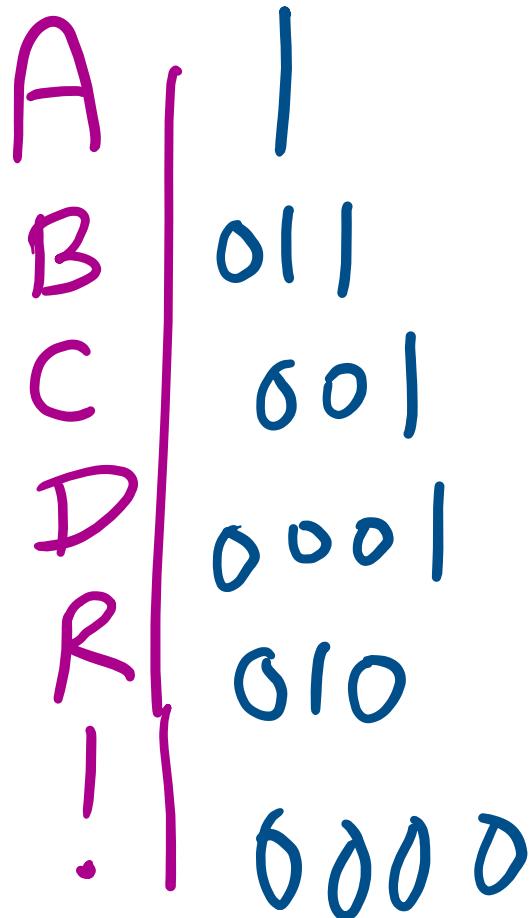
# Example

- Build a tree for “ABRACADABRA!”



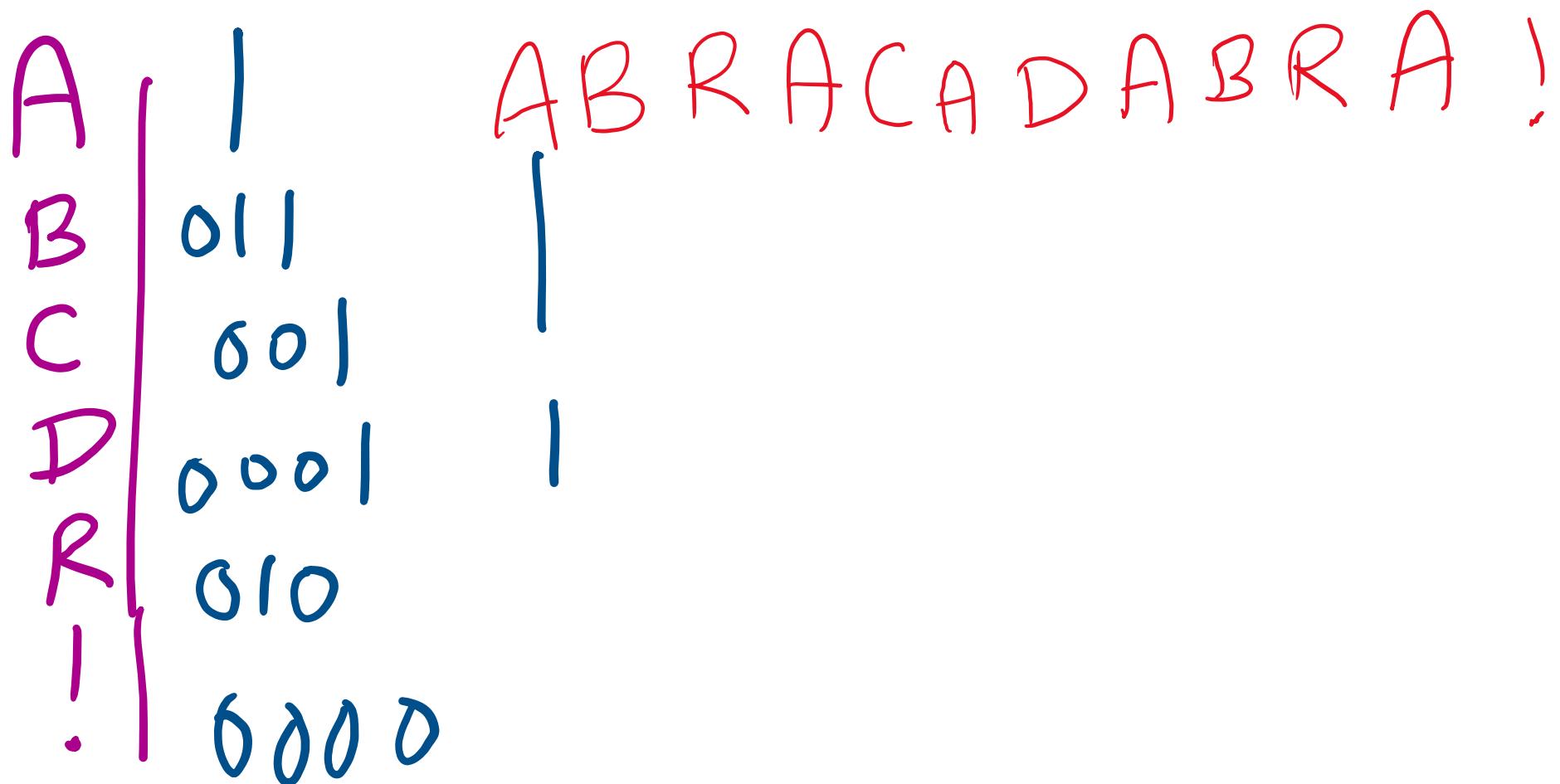
# Example

- Build a tree for “ABRACADABRA!”



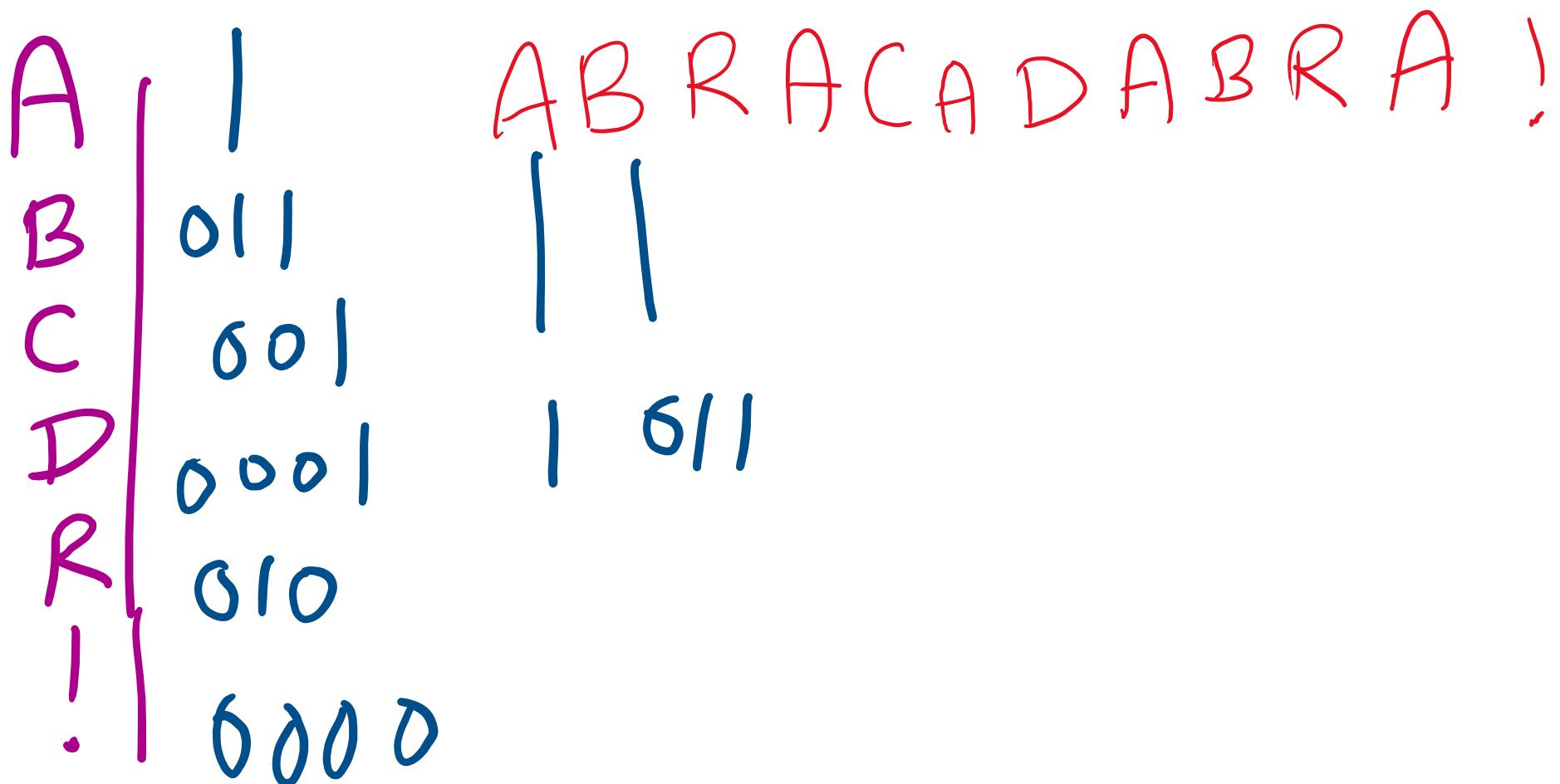
# Example

- Build a tree for “ABRACADABRA!”



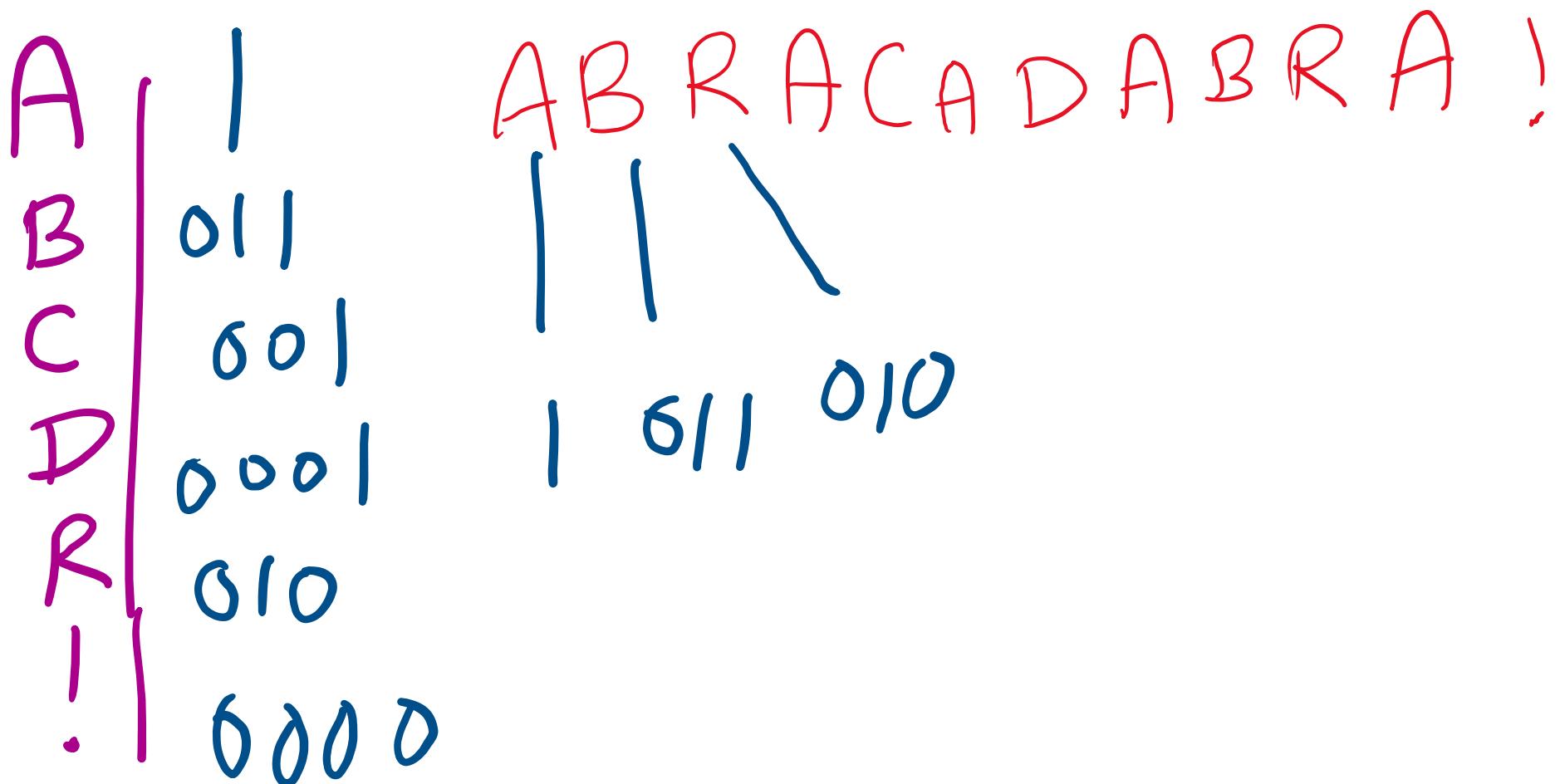
# Example

- Build a tree for “ABRACADABRA!”



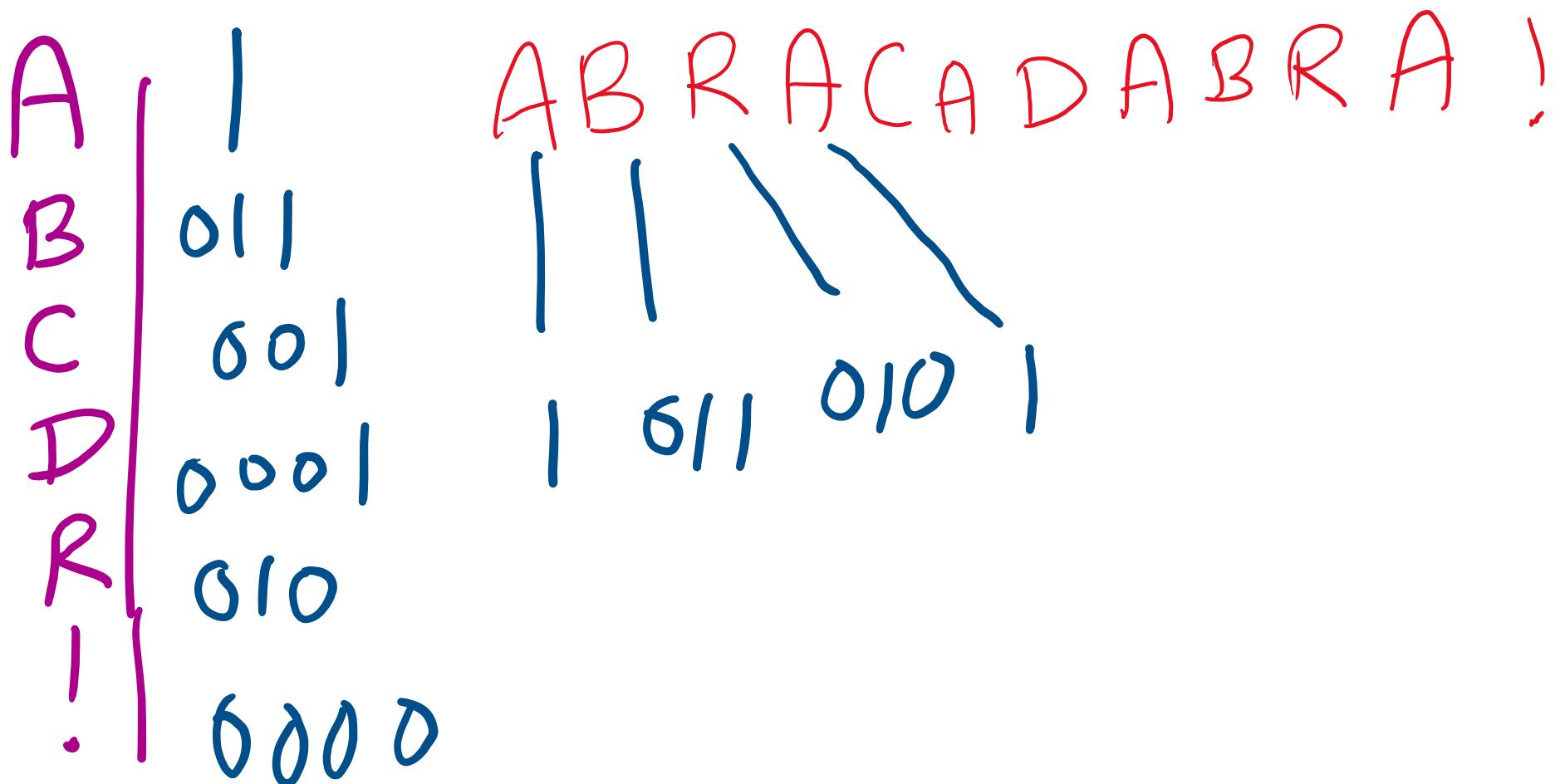
# Example

- Build a tree for “ABRACADABRA!”



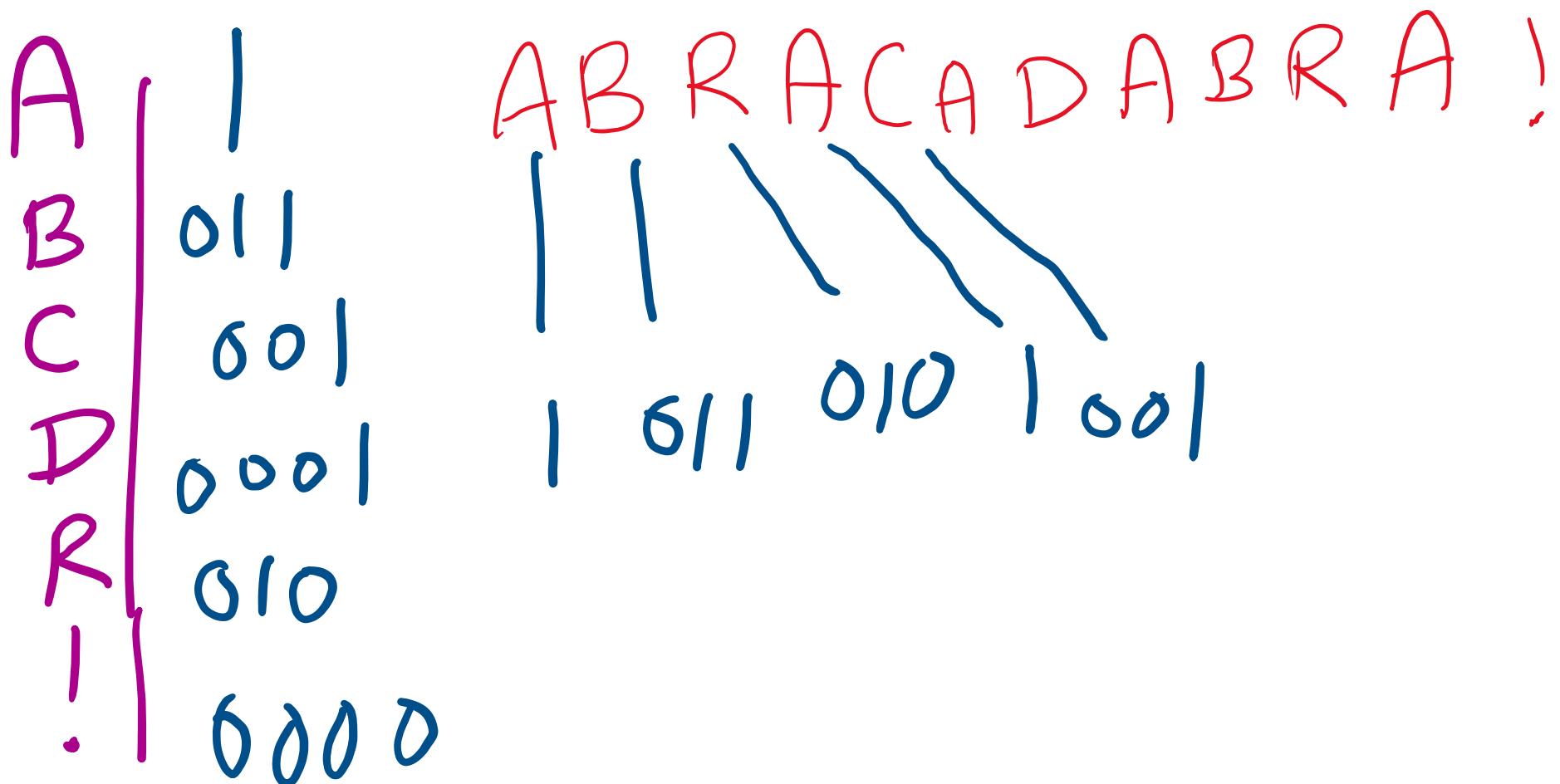
# Example

- Build a tree for “ABRACADABRA!”



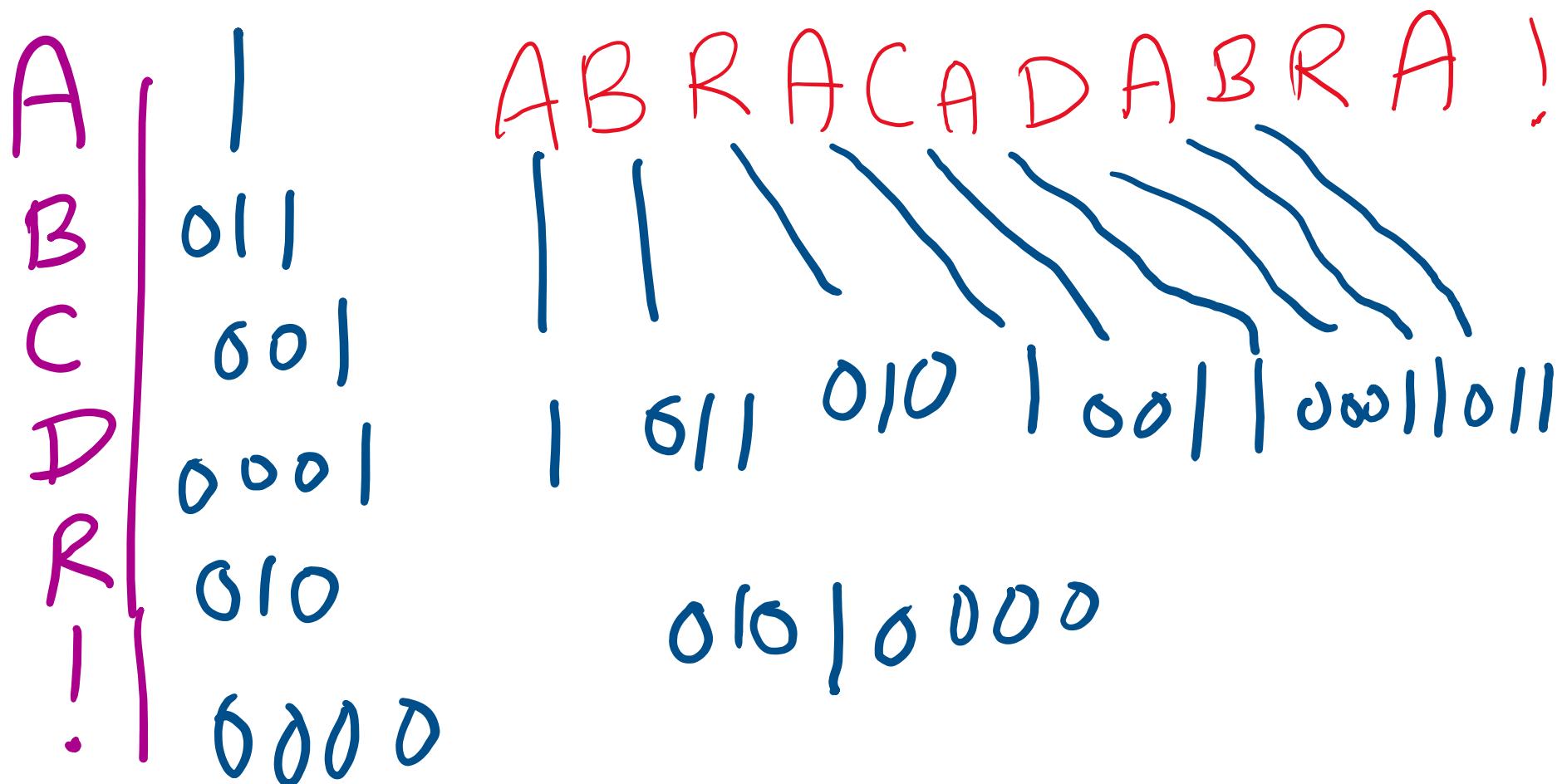
# Example

- Build a tree for “ABRACADABRA!”



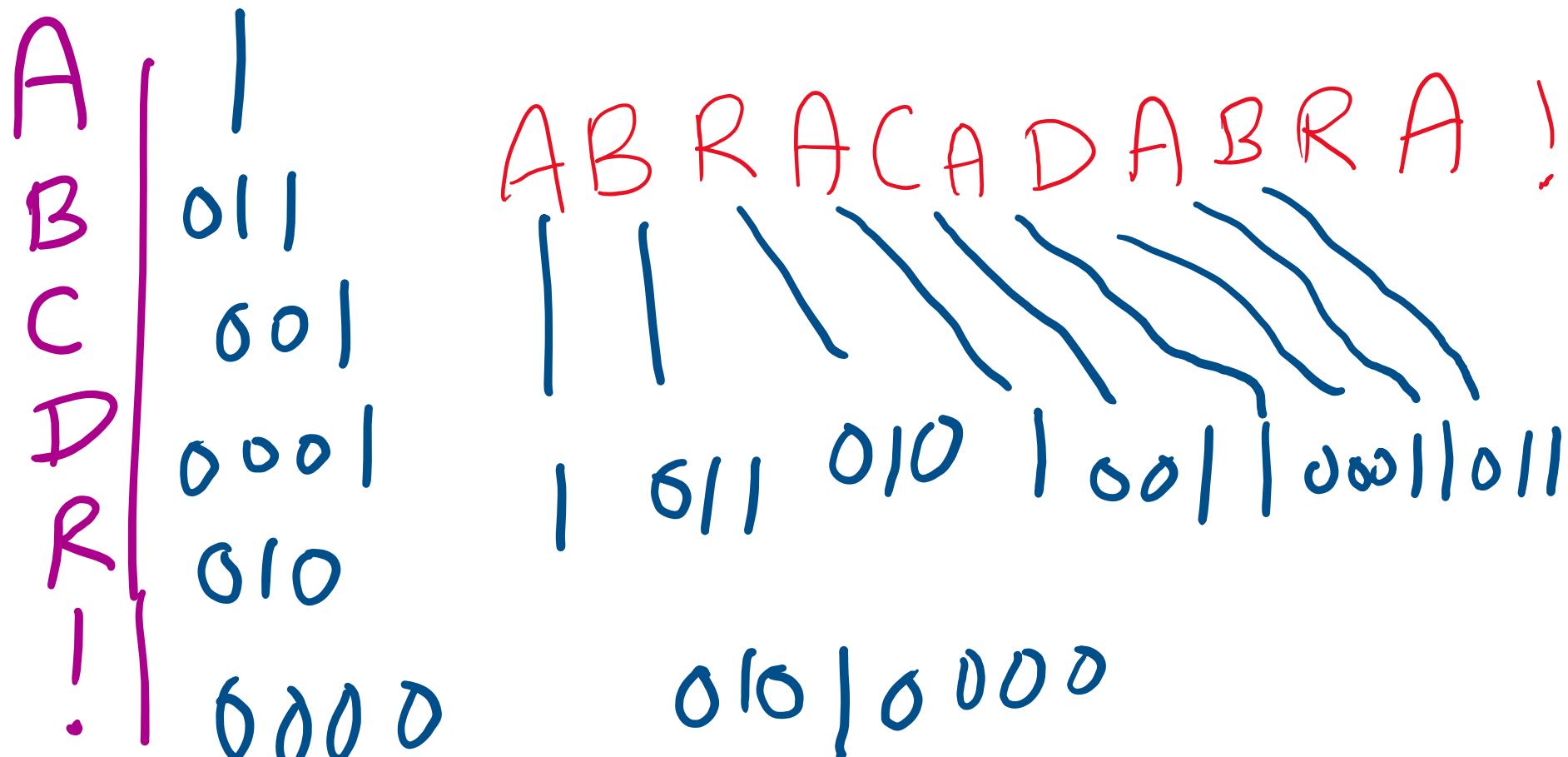
# Example

- Build a tree for “ABRACADABRA!”



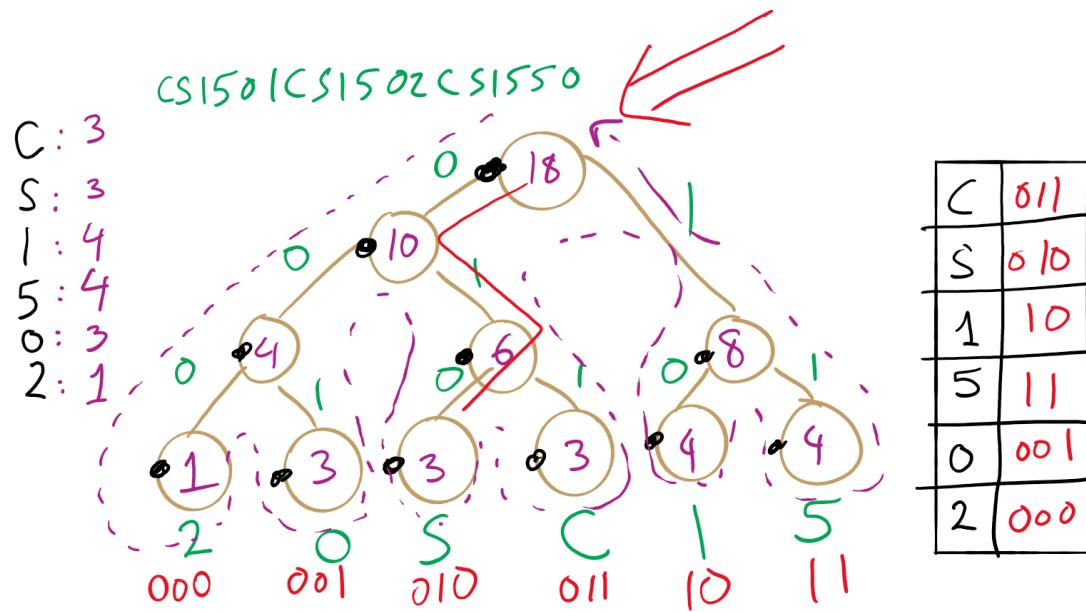
# Example

- Build a tree for “ABRACADABRA!”



- Compressed size: 28
  - Original size:  $12 \times 8 = 96$  bits
  - Compression ratio = 28/96

# Huffman Compression Example



CS 1 5 0 | CS 1 5 0 2 CS 1 5 5 0  
011 010 10 11 001 10 011 010 10 11 11 001

Trie 0001 [ASCII for 2] 1 [ASCII for 0] 1 [ASCII for 5] - - - -  
CS1

# Implementation concerns

- Need to efficiently be able to select lowest weight trees to merge when constructing the trie
  - Can accomplish this using a *priority queue*
- Need to be able to read/write bitstrings!
  - Unless we pick multiples of 8 bits for our codewords, we will need to read/write *fractions* of bytes for our codewords
    - We're not actually going to do I/O on fraction of bytes
    - We'll maintain a buffer of bytes and perform bit processing on this buffer
    - See `BinaryStdIn.java` and `BinaryStdOut.java`

# We need to read and write individual bits: Binary I/O

```
private static void writeBit(boolean bit) {  
    // add bit to buffer by shifting in a zero  
    buffer <<= 1;  
    if (bit) buffer |= 1; //then turning it to one if needed  
    // if buffer is full (8 bits), write out as a single byte  
    N++;  
    if (N == 8) clearBuffer();  
}
```

```
writeBit(true);  
writeBit(false);  
writeBit(true);  
writeBit(false);  
writeBit(false);  
writeBit(false);  
writeBit(false);  
writeBit(true);
```

buffer:



00000000

N:



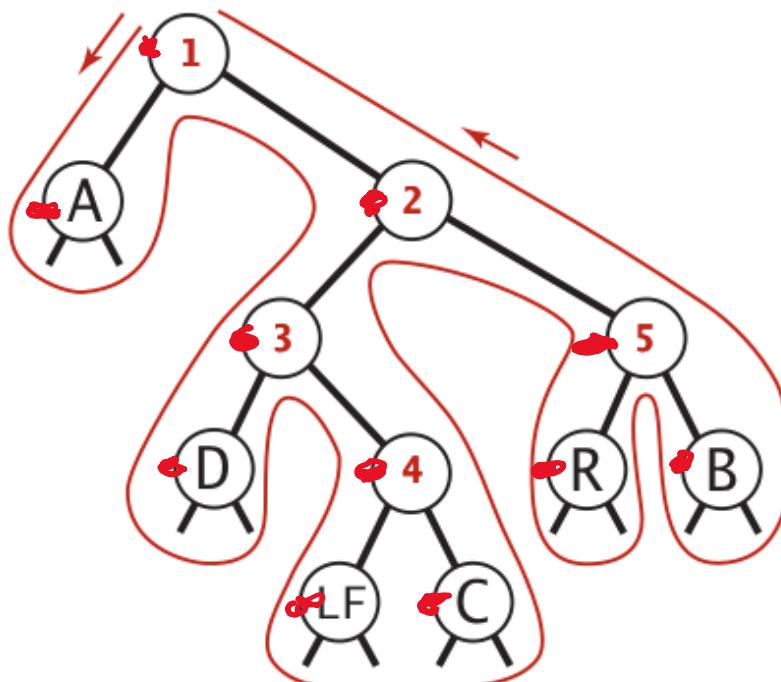
0

# Further implementation concerns

- To encode, we'll need to read in characters and output codes
- To decode, we'll need to read in codes and output characters
- Sounds like we'll need a symbol table!
  - What implementation would be best?
    - Same for encoding and decoding?
    - Note that this means we need access to the trie to expand a compressed file!
      - Let's store the trie in the compressed file
      - how?

# Representing tries as bitstrings

## Preorder traversal

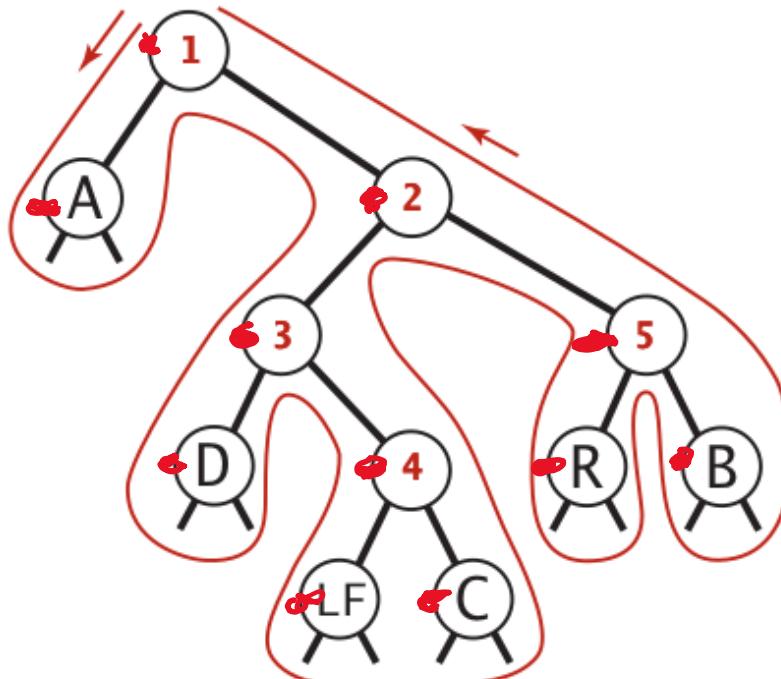


internal node → 0

leaf node → 1 followed by ASCII code of char inside

# Representing tries as bitstrings

## Preorder traversal

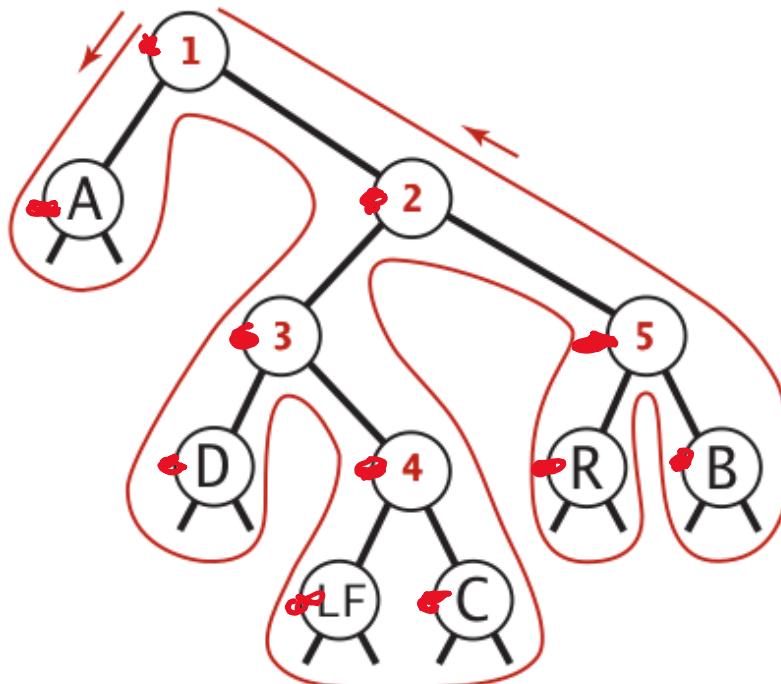


*led*

0  
↑  
1

# Representing tries as bitstrings

## Preorder traversal

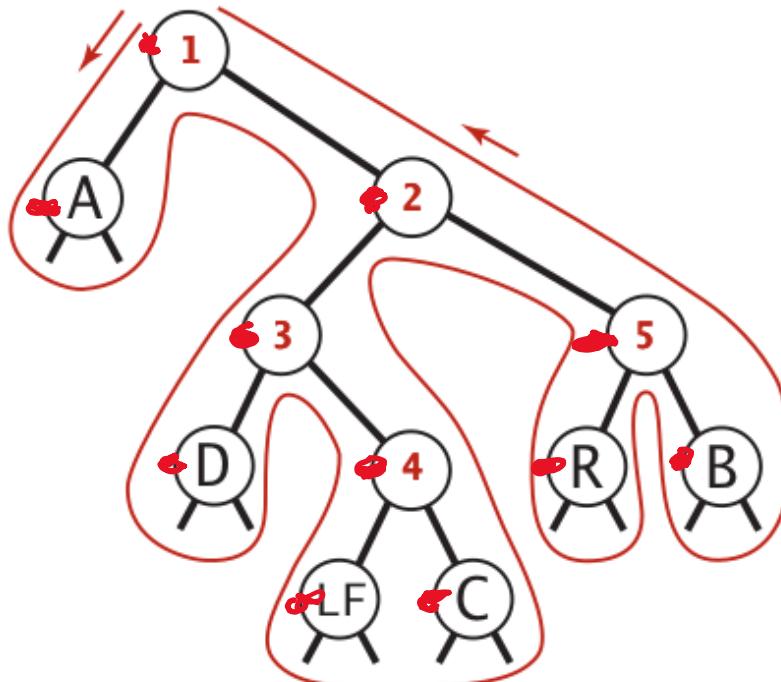


leaves

↓  
A  
0101000001  
↑  
1

# Representing tries as bitstrings

## Preorder traversal

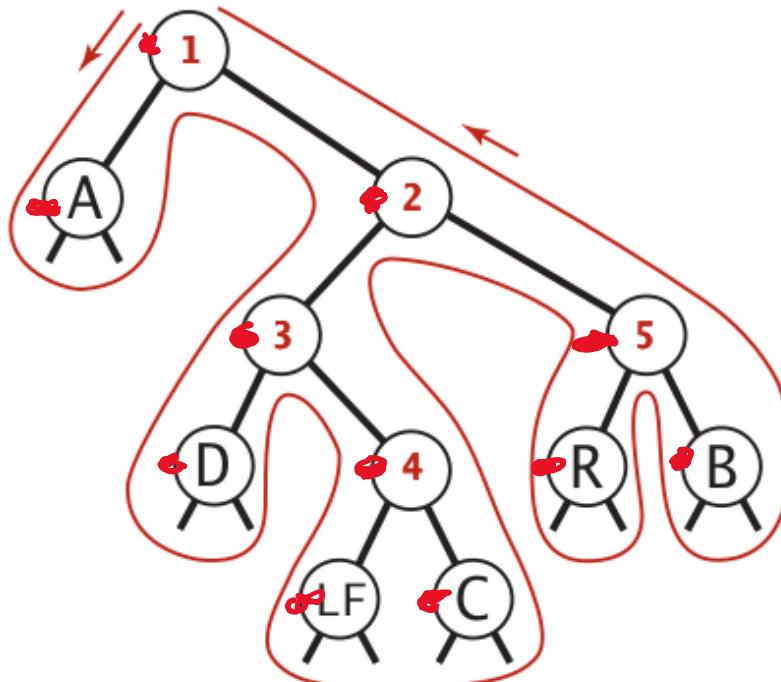


leaves

↓  
A  
01010000010  
↑ 1           ↑ 2

# Representing tries as bitstrings

## Preorder traversal

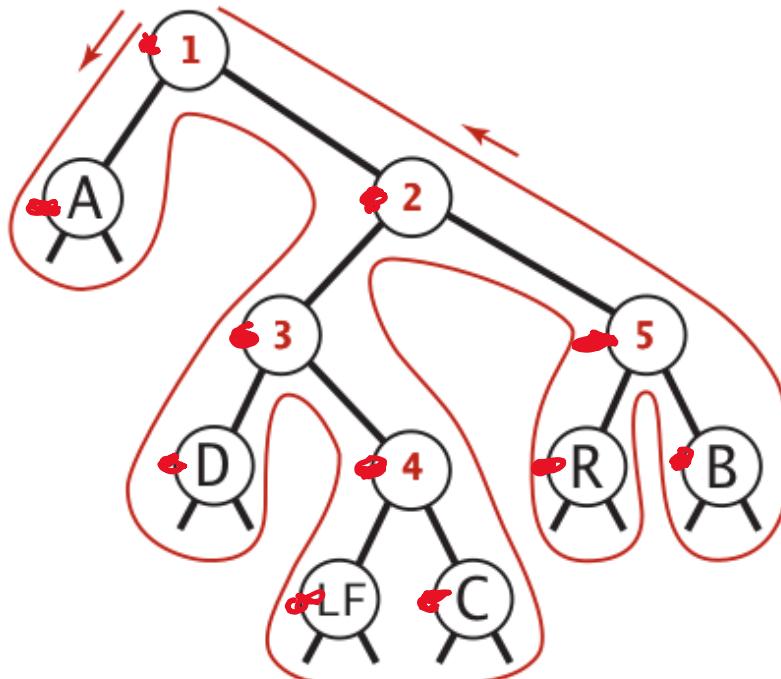


leaves

↓  
A  
010100000100  
↑↑  
1 2 3

# Representing tries as bitstrings

## Preorder traversal

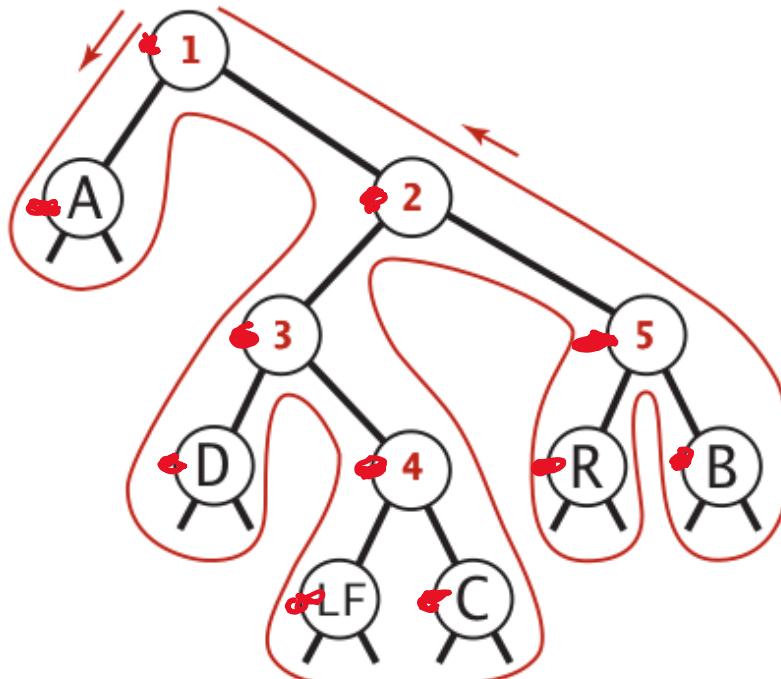


*leaves*

↓            A            ↓            D  
010100000100101000100  
↑            ↑            ↑  
1            2 3

# Representing tries as bitstrings

## Preorder traversal



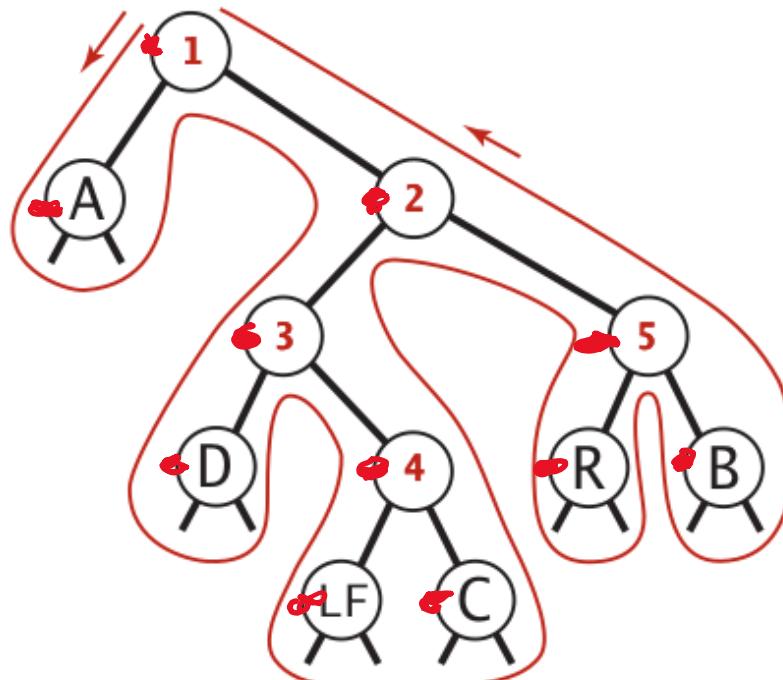
leaves

↓	A	↓	D
<hr/>			
0	1	0	1
10	10	00	10
00	00	10	00
0	0	1	0

↑  
1  
↑↑  
2 3  
↑  
4

# Representing tries as bitstrings

## Preorder traversal

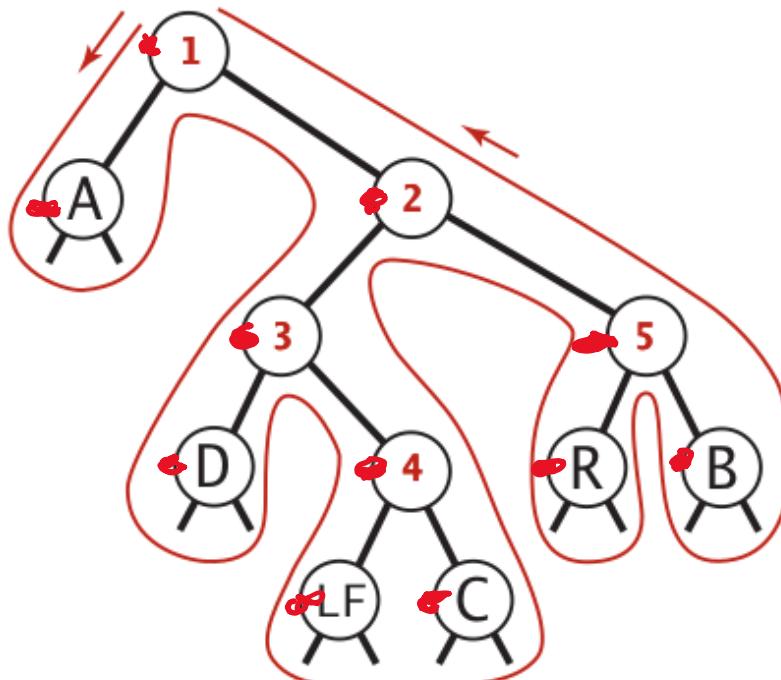


leaves

↓      A      ↓      D      ↓      LF  
010100000100101000100001010:  
↑      ↑      ↑  
1      2 3      4

# Representing tries as bitstrings

## Preorder traversal

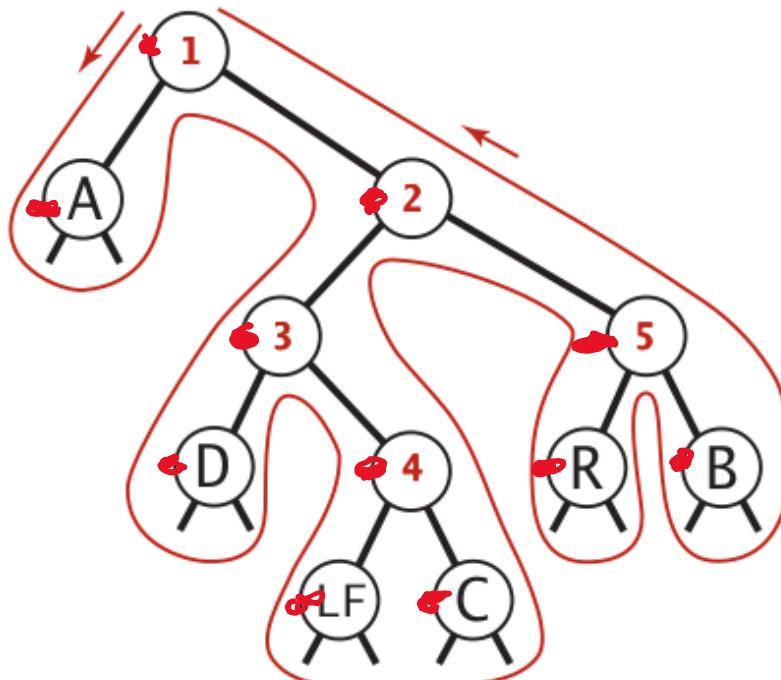


leaves

↓	<u>A</u>	↓	<u>D</u>	↓	<u>LF</u>	↓	<u>C</u>
0	101000001	001	01010001000	0	10000101010101000011		
↑		↑↑		↑			
1		2 3		4			

# Representing tries as bitstrings

## Preorder traversal

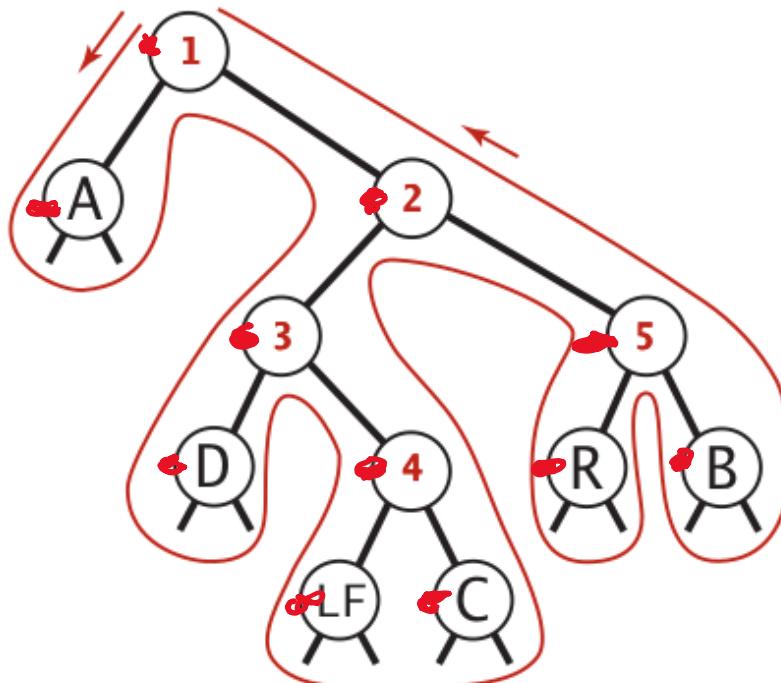


leaves

↓	<u>A</u>	↓	<u>D</u>	↓	<u>LF</u>	↓	<u>C</u>	
0	101000001	00	1010001000	0	10000101010101000011	0		
↑		↑↑		↑			↑	
1		2 3		4			5	

# Representing tries as bitstrings

## Preorder traversal

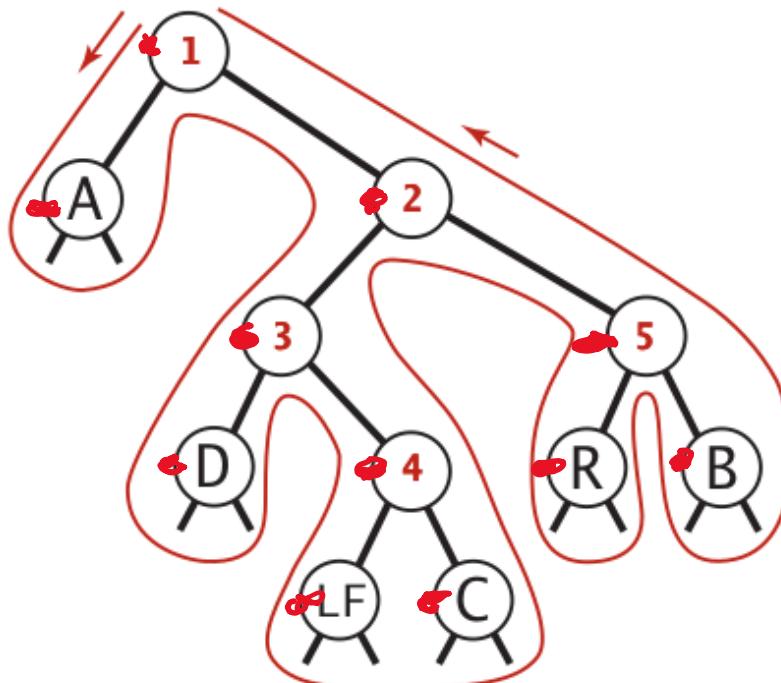


leaves

	A		D		LF		C		R
↓		↓		↓		↓		↓	
0	101000001	00	1010001000	0	1000010101	0101000011	0101010010		
↑		↑↑		↑					
1		2 3		4					
									← int

# Representing tries as bitstrings

## Preorder traversal



leaves

↓	<u>A</u>	↓	<u>D</u>	↓	<u>LF</u>	↓	<u>C</u>	↓	<u>R</u>	↓	<u>B</u>
0	101000001	00	1010001000	0	1000010101	0101000011	0	1010100101	0101000010		
↑			↑↑		↑			↑			
1			2 3		4			5			

*internal nodes*

# Writing a trie

```
private static void writeTrie(Node x){  
    if (x.isLeaf()) {  
        BinaryStdOut.write(true);  
        BinaryStdOut.write(x.ch);  
        return;  
    }  
    BinaryStdOut.write(false);  
    writeTrie(x.left);  
    writeTrie(x.right);  
}
```

# Reading a trie back

Similar to the read tree lab!

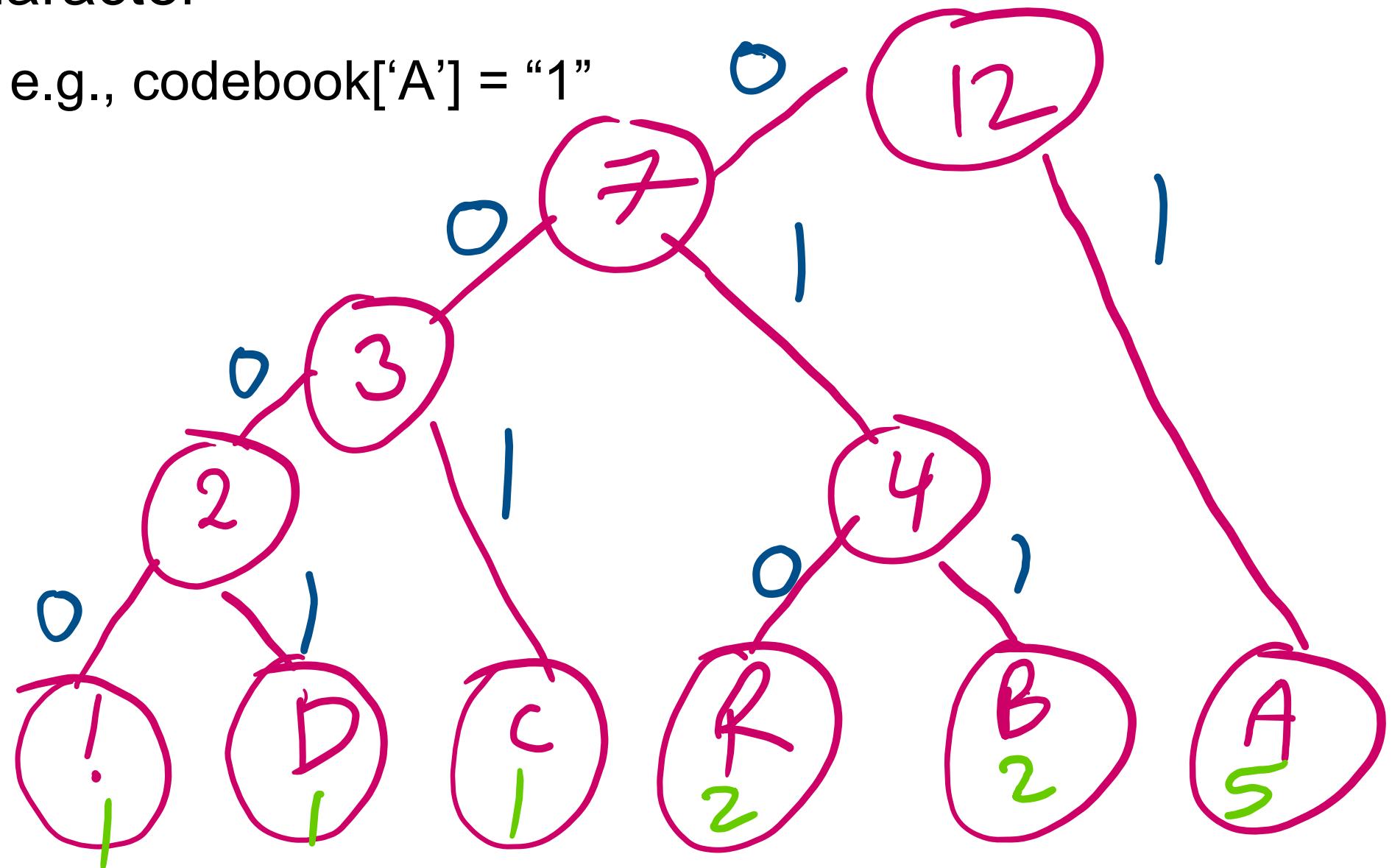
```
private static Node readTrie() {  
    if (BinaryStdIn.readBoolean())  
        return new  
Node(BinaryStdIn.readChar(), 0, null,  
null);  
  
    return new Node('\0', 0, readTrie(),  
readTrie());  
}
```

# Huffman pseudocode

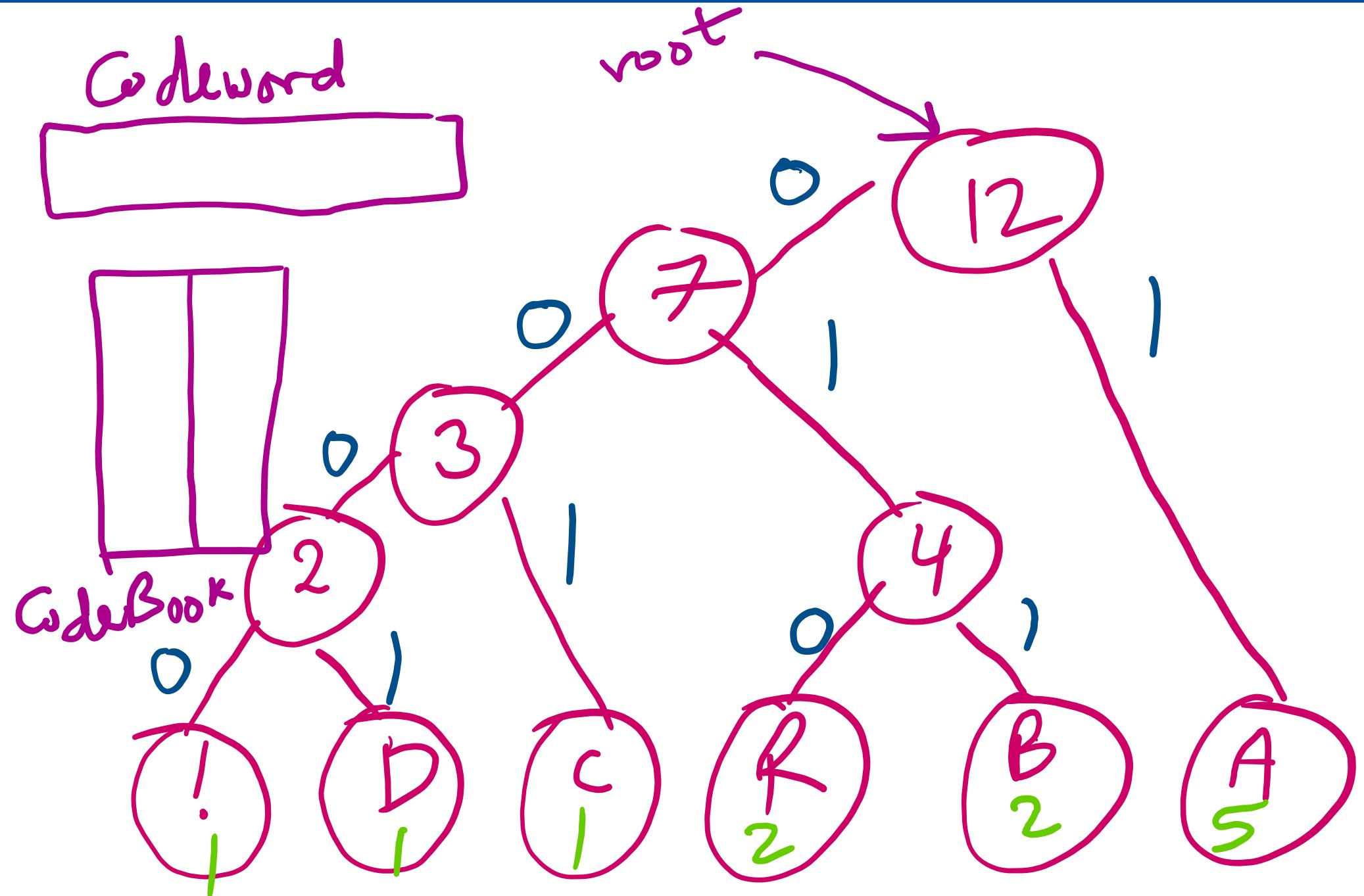
- Encoding approach:
  - Read input
  - Compute frequencies
  - Build trie/codeword table
  - Write out trie as a bitstring to compressed file
  - Write out character count of input (**why is that necessary?**)
  - Use table to write out the codeword for each input character
- Decoding approach:
  - Read trie
  - Read character count
  - Use trie to decode bitstring of compressed file

# Huffman Compression: Generating the Codebook

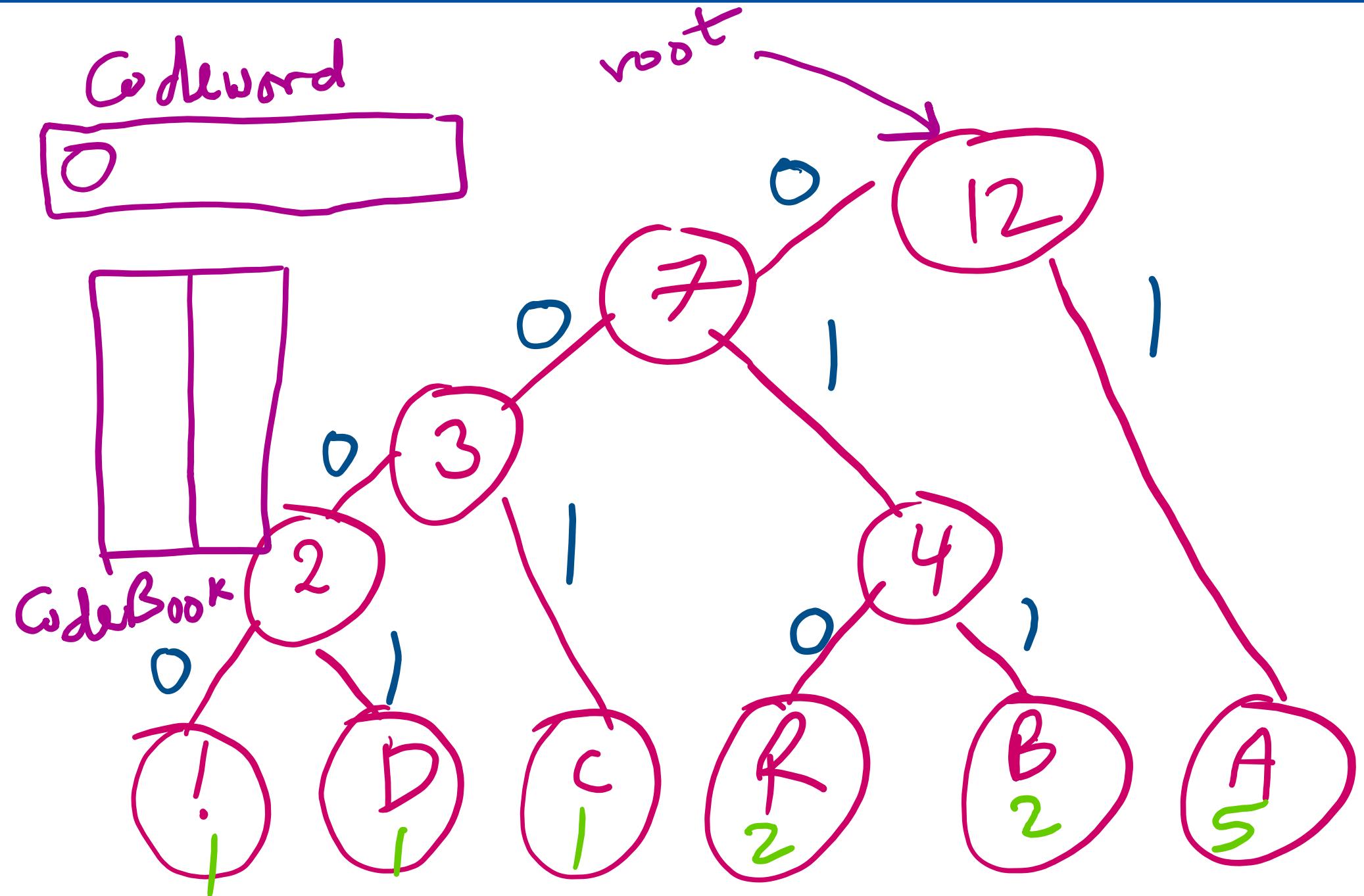
- The codebook is a table of codewords indexed by character
  - e.g.,  $\text{codebook}['A'] = "1"$



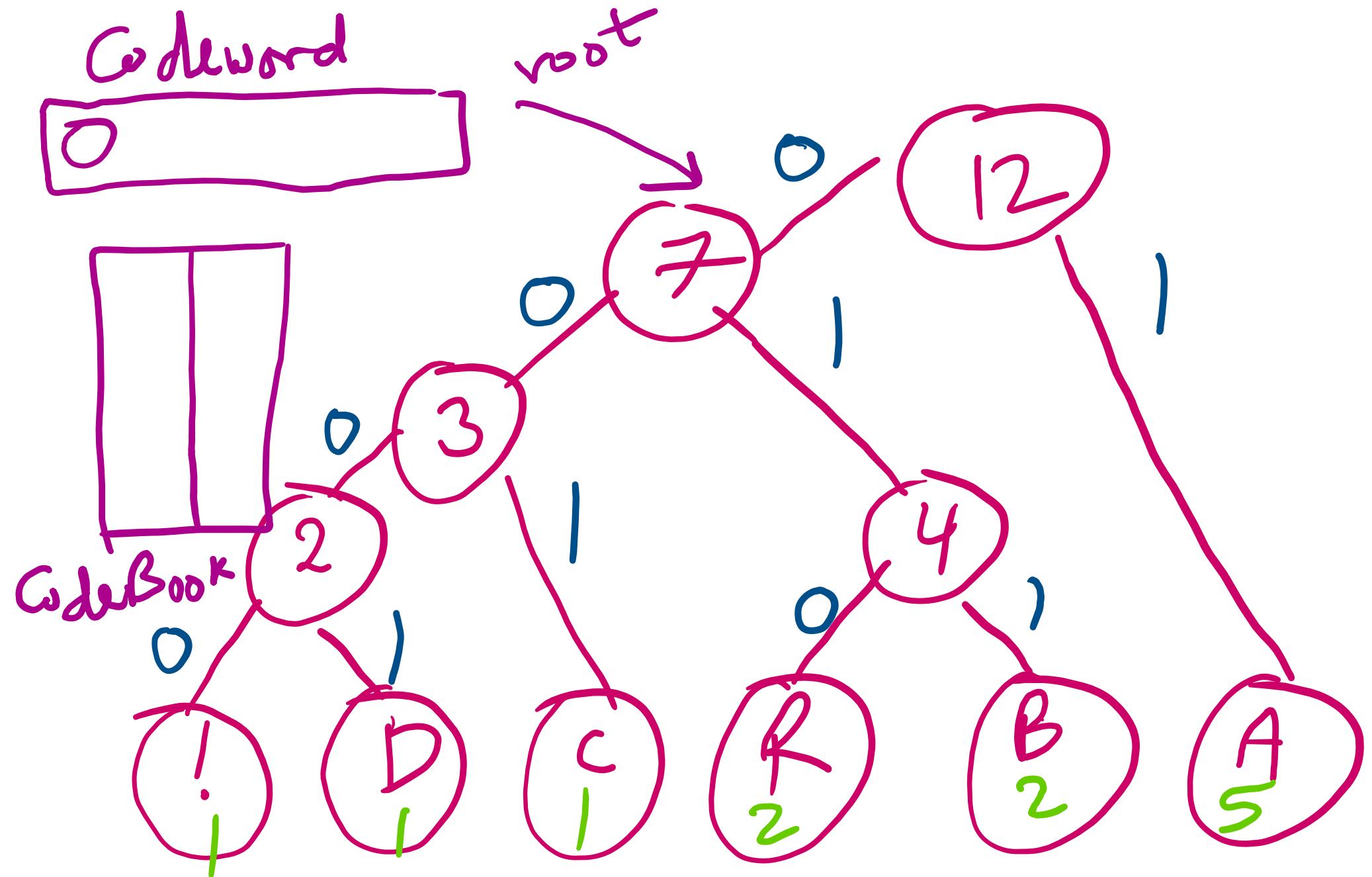
# Huffman Compression: Generating the Codebook



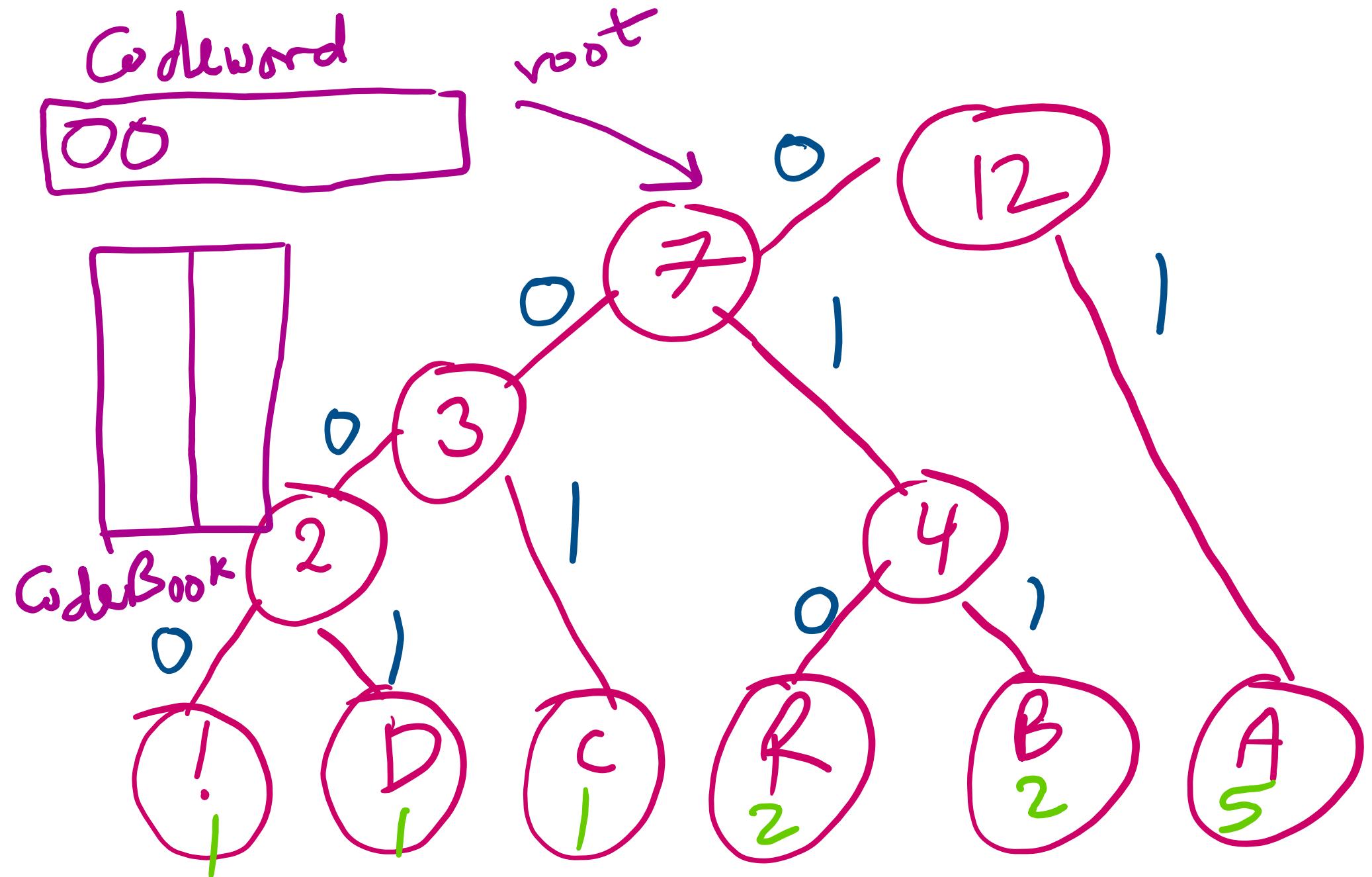
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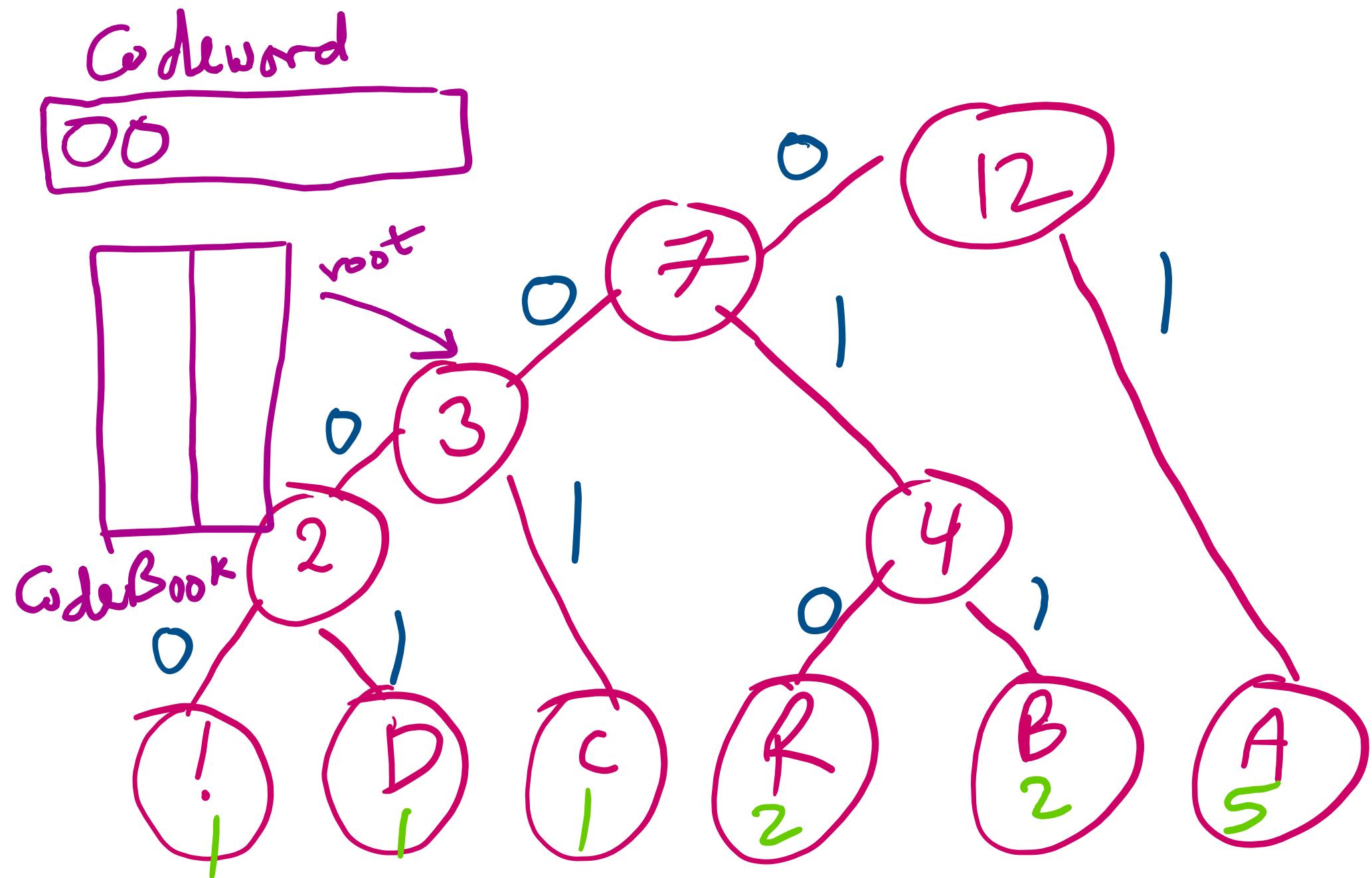
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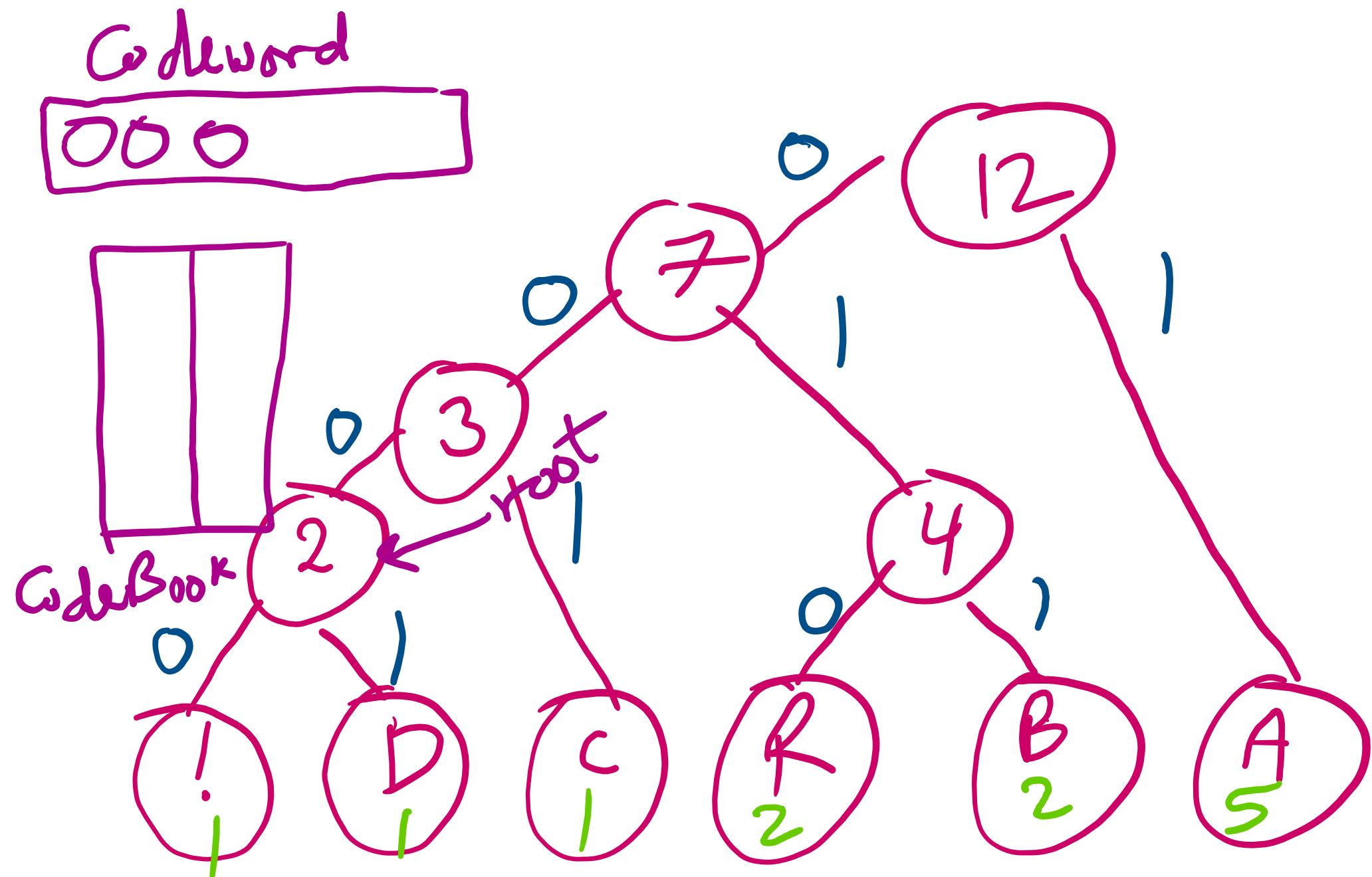
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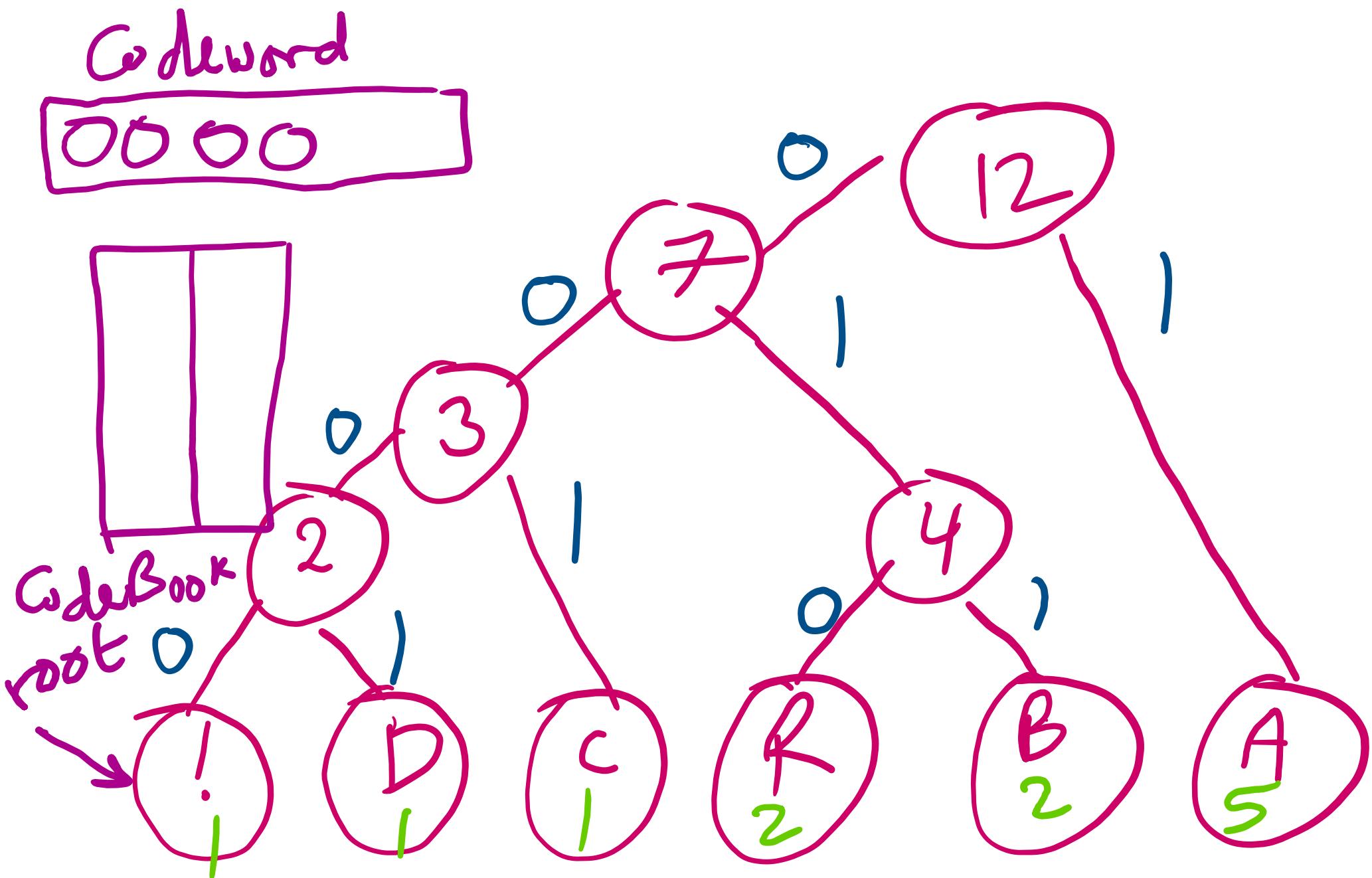
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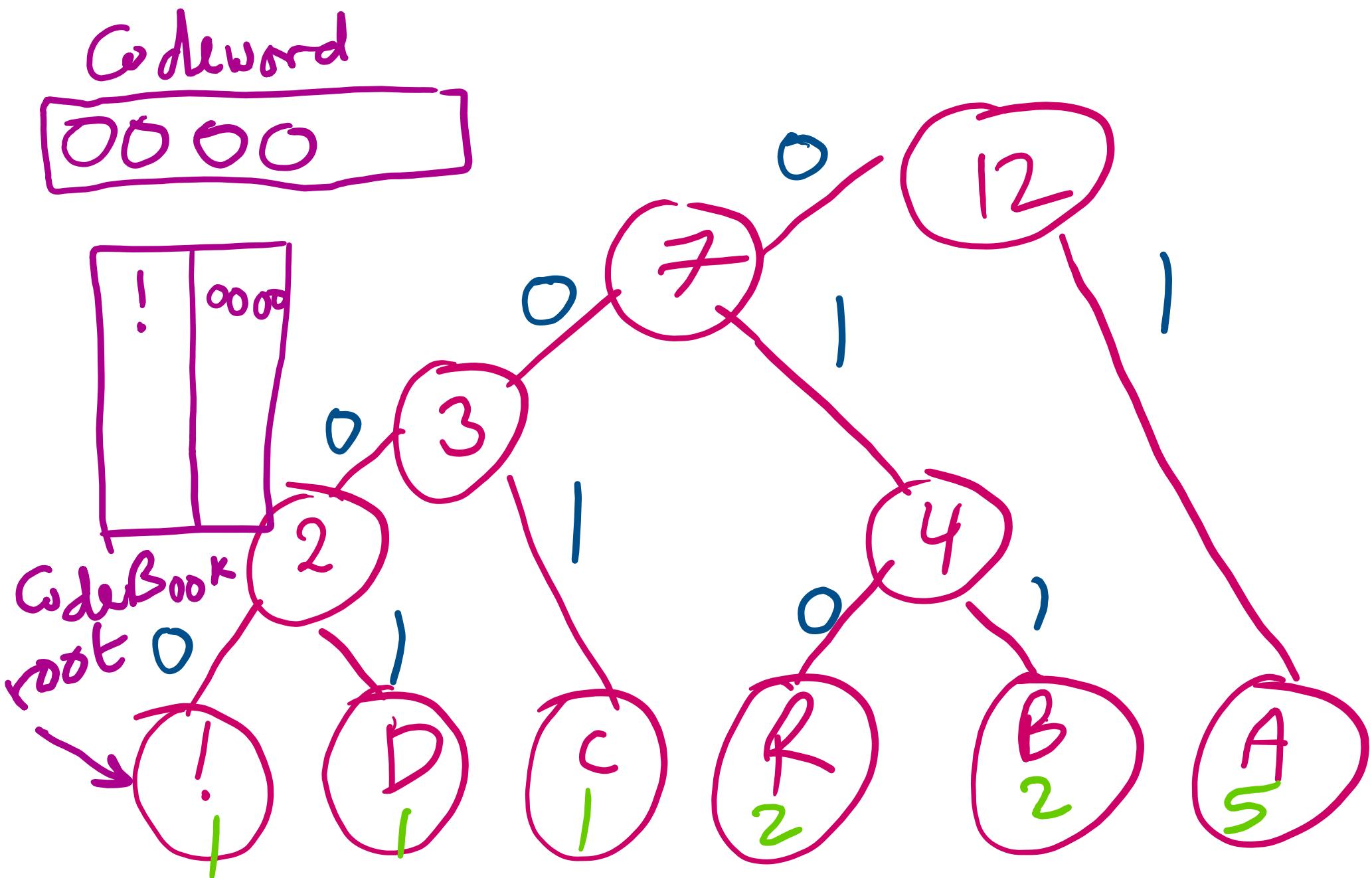
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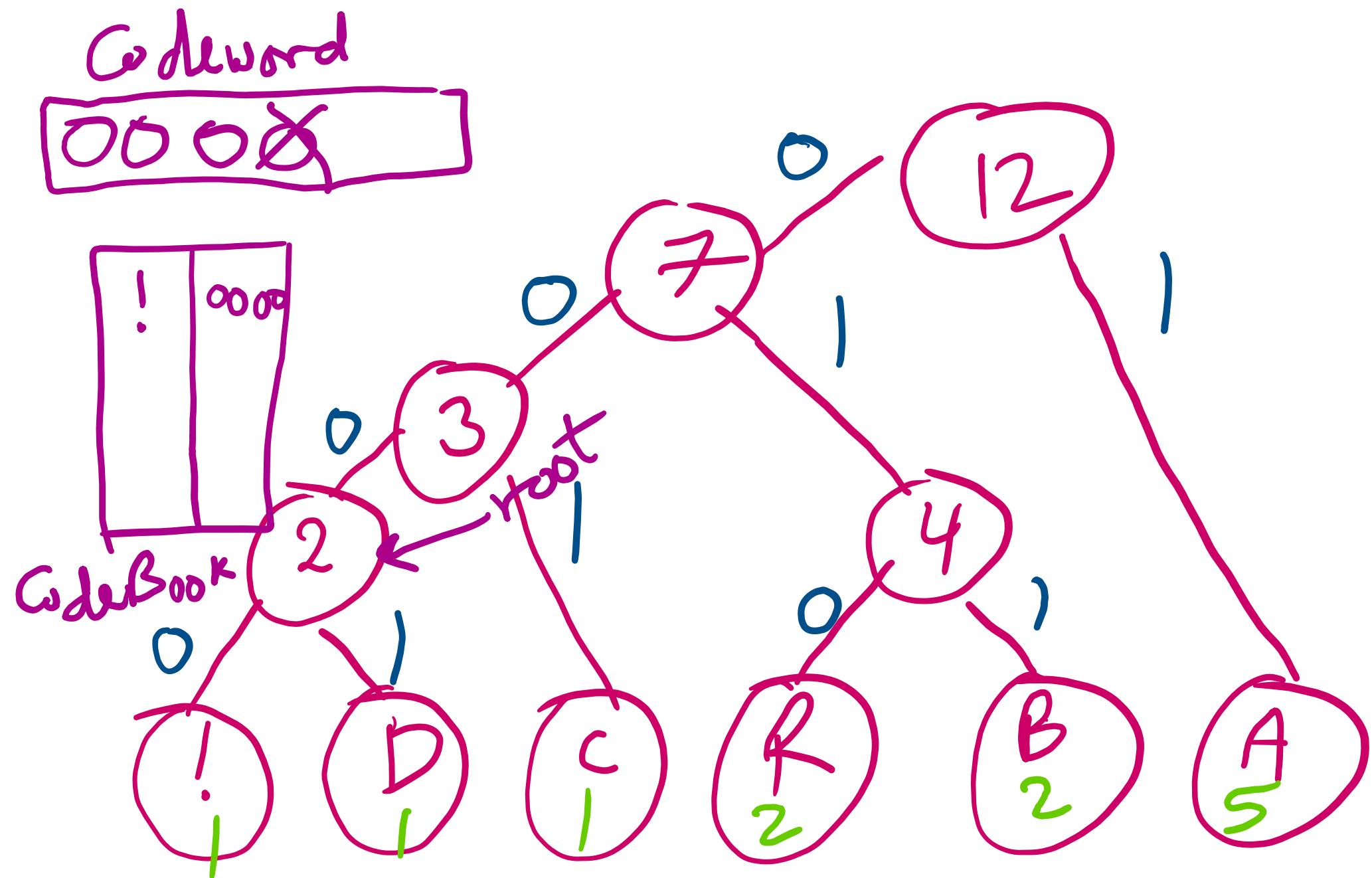
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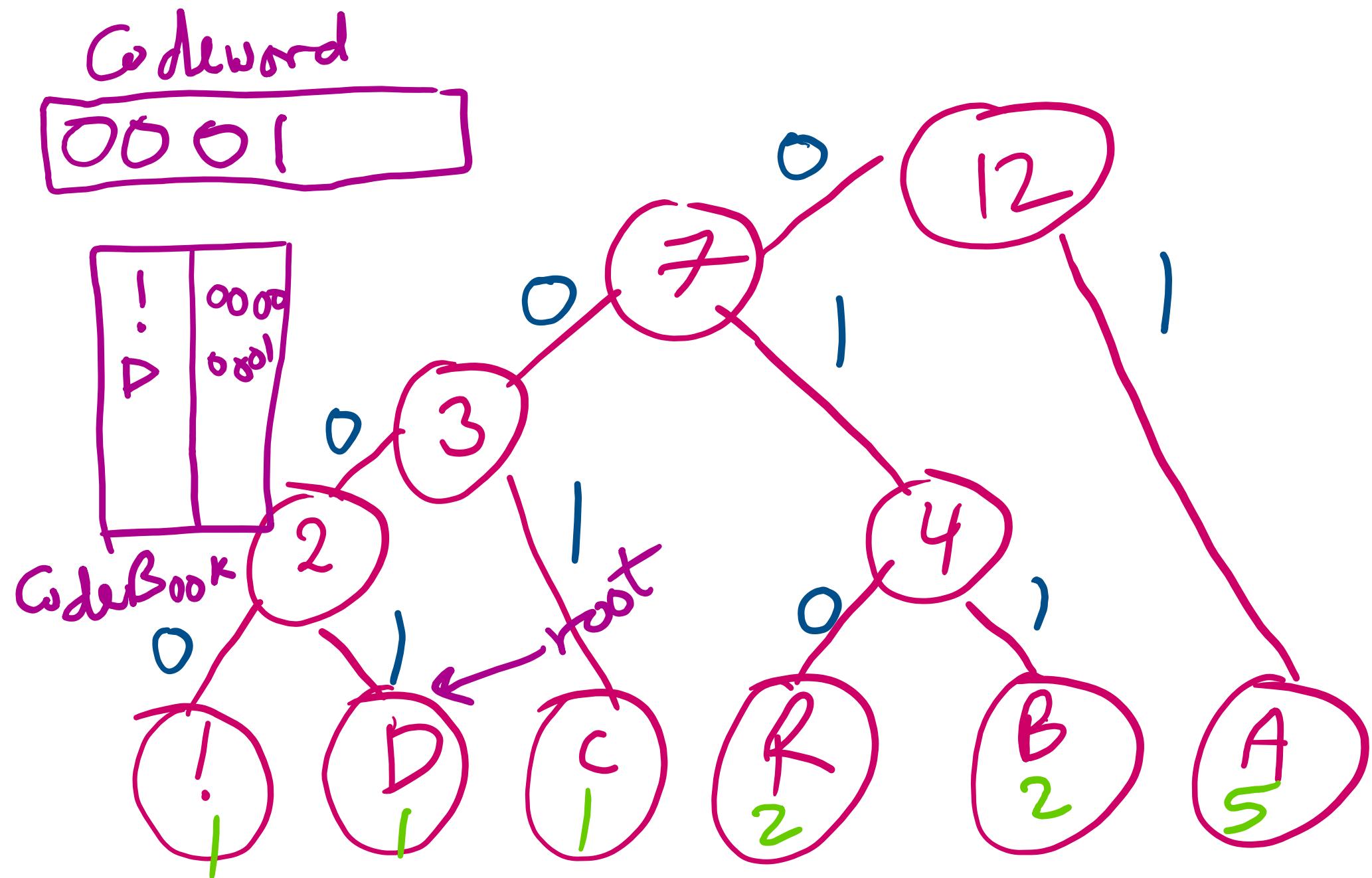
# Huffman Compression: Generating the Codebook



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```
void generateCodeBook(Node root, StringBuilder codeword) {  
    if(root.isLeaf()){  
        codebook[root.data] = codeword.toString();  
    }  
    if(root.left != null){  
        //append 0 to codeword, move left, pop last character in codeword  
    }  
    if(root.right != null){  
        //append 1 to codeword, move right, pop last character in codeword  
    }  
}
```